

Quantifying the decay timescale of volcanic sulfur dioxide in the stratosphere

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Abstract. The injection of sulfur dioxide (SO₂) into the stratosphere and its subsequent oxidation to form sulfate aerosols after large volcanic eruptions can have profound effects on Earth's climate. The removal of volcanic SO₂ in the stratosphere is thought to be driven by its gas-phase oxidation by the hydroxyl radical (OH); once oxidized, it goes on to form sulfate aerosols. However, it has also been suggested that heterogeneous oxidation on ash could also be important or even dominant, which would imply faster removal of SO₂ and thus faster formation of aerosols at least in ash-rich plumes. Additionally, recent work uses an assumed exponential fit to determine the total SO₂ mass loading following large eruptions; the quality of this fit translates directly to the accuracy of the mass loading estimate. It is therefore of interest to examine how accurately the SO₂ decay timescale can be determined from observations, and compare observations to models. Here we evaluate the SO₂ decay timescale and its uncertainties following several significant eruptions using three different sets of satellite observations and compare these to the CESM2-WACCM6 model. We show that defining an accurate baseline against which a volcanic injection can be quantified increases the variability and uncertainty in the estimated decay timescale for some satellite data sets. We find that uncertainties across different altitudes and eruptions make it difficult to attribute variations in decay timescale to specific SO₂ removal processes for the events examined.

1 Introduction

The stratospheric aerosol layer is predominantly composed of sulfuric acid and water particles and plays a key role in both atmospheric chemistry and climate. These particles provide surfaces on which the activation of ozone-depleting chlorine takes place, and they can backscatter part of the incoming solar radiation out to space, moderating surface temperatures. Understanding the processes controlling stratospheric aerosol formation and residence times thus hinges on understanding the physical and chemical mechanisms influencing sulfur in the stratosphere. The most important sulfur-containing species for stratospheric aerosol formation is sulfur dioxide (SO₂). SO₂ is emitted naturally through volcanoes and anthropogenically via the combustion of fossil fuels and the smelting of sulfur-containing metal ore (Pumphrey et al., 2015).

An important source of stratospheric SO₂ in non-volcanic conditions is the photolysis of carbonyl sulfide (COS), which is the most abundant sulfur-containing gas in the atmosphere (Kremser et al., 2016). Important sources of COS include its direct flux from the ocean, oxidation of marine-originating dimethyl sulfide and carbon disulfide, and direct and indirect anthropogenic

emissions, among others (Kremser et al., 2016). With a tropospheric lifetime on the order of years (Brasseur and Solomon, 2005), COS is transported to the stratosphere, where it then photolyzes and ultimately produces SO₂. Anthropogenic SO₂ can also frequently reach the stratosphere in the tropics via deep convection, especially in the Indian monsoon (Neely et al., 2014).

However, by far the most significant perturbations in stratospheric SO₂ are the result of moderate- to large-magnitude volcanic eruptions (volcanic explosivity index (VEI) 3+ and ≥1 Tg SO₂ emitted) (Solomon et al., 2011; Kremser et al., 2016; Schmidt et al., 2018; Carn et al., 2016). These Plinian-type eruptions feature plumes that entrain and heat ambient air as they rise, enhancing their own buoyancy and enabling them to ascend well above the tropopause (Carey and Bursik, 2000). Once it reaches the stratosphere in the plume, the SO₂ gas is oxidized and forms sulfate aerosols. The gas-phase oxidation process for stratospheric SO₂ involves the following reaction sequence (Brasseur and Solomon, 2005):



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where the initial oxidation of SO₂ by OH is the rate-limiting step. Depending on the environment in which the H₂SO₄ gas is present, it will either readily get taken up into pre-existing particles (increasing their size) or nucleate along with water vapor to form new particles (Yue, 1981). Once formed, stratospheric sulfate aerosols have a residence time of 1 to 2 years (Kremser et al., 2016).

Given the far-reaching impacts of sulfur-derived stratospheric volcanic aerosols on both climate (McCormick et al., 1995; Schmidt et al., 2018) and ozone (O₃) depletion (Solomon et al., 1998), quantifying the amount of SO₂ reaching the stratosphere following a major volcanic eruption and its subsequent chemical fate is important. In this work, we seek to characterize the decay timescale SO₂ following large volcanic eruptions, which reflects the oxidation rate of SO₂. Moreover, since the rate-limiting step in the conversion of SO₂ to sulfate aerosol is the initial oxidation of SO₂, one would expect that the rate of sulfate formation should match the rate of SO₂ removal. Indeed, these two timescales following the eruption of Sarychev in 2009 are quite similar (Fig. S1). Thus a better understanding of SO₂ removal times also translates to a better understanding of sulfate aerosol formation times.

In addition to understanding the chemical fate of SO₂, an exponential fit of the SO₂ decay following large eruptions can be used to estimate the total stratospheric SO₂ mass burden. (Pumphrey et al., 2015; Höpfner et al., 2015). The SO₂ mass burden is a key quantity for assessing the climate and chemical impacts of SO₂, but—when calculated with this method—its accuracy depends on the accuracy of the exponential fit.

Based on the gas-phase oxidation process given in the reactions in R1–R3, one would expect that the decay timescale of SO₂ increases with height due to the exponential decrease of pressure with height which limits the rate of reaction R1. Indeed, Carn

et al. (2016), in their review of satellite measurements of volcanic degassing, show a substantial increase in total-column SO₂ *e*-folding time with injection height, ranging from less than a day for those eruptions that don't penetrate the tropopause to upwards of 40 days for the largest eruptions in the last hundred years (see their Fig. 14). However, total column measurements
60 do not tell the whole story: Höpfner et al. (2015) use vertically resolved observations from the Michelson Interferometer for Passive Atmospheric Sounding (MIPAS) and find that for a given eruption, the SO₂ *e*-folding time generally increases across 10 to 14 km, 14 to 18 km, and 18 to 22 km height bins (see their Table 3).

While these observations of the height dependence of the SO₂ decay timescale broadly match what we would expect based on the reactions in R1–R3, recent work has suggested other possible oxidation mechanisms for SO₂ in the stratosphere. Zhu
65 et al. (2020) compared observed total column SO₂ decay timescales to model simulations following the 2014 eruption of Kelut in Indonesia. The eruption was notable in part because of a persistent layer of volcanic ash that remained for months after the eruption. They suggest that chemistry involving ash leads to a much shorter timescale of SO₂ (17 days when ash is included in their model versus 22–26 days with no ash; see their Table 1). However, Zhu et al. (2020) examined just one volcano, and the timescales they report fall within the range of values reported by Höpfner et al. (2015). The importance of ash in setting
70 the decay timescale of SO₂ remains inconclusive. Here we further examine available data on SO₂ decay following several different eruptions from different satellites.

1.1 A comment on terminology

Before preceding with the rest of the paper, we think it is useful to clarify precisely what we are calculating with respect to the removal of SO₂ from the stratosphere. As discussed thoroughly in recent work by Toohey et al. (2024), terms such as
75 “residence time”, “*e*-folding time”, and “decay timescale” are taken to be synonymous, when in fact they refer to related but distinct quantities.

Following the discussion in Toohey et al. (2024), consider a tracer injected into a reservoir at time $t = 0$. The mean residence time is the average of the residence times for the tracer particles leaving the reservoir. The *e*-folding time is the time required for the concentration of the tracer in the reservoir to reach $1/e$ of its initial value. When the removal of the tracer is a pure
80 exponential decay, the residence time will equal the *e*-folding time. However, both of these quantities can be defined, regardless of the functional form of the decay; for non-exponential decay, they are not necessarily equal.

In this paper we focus on the “decay timescale” of SO₂, which can be defined as follows. Let $W(t)$ be the concentration of the tracer in the reservoir after time $t = 0$. The decay timescale τ_d is defined as

$$\tau_d = \left[\frac{d}{dt} \left(\ln \left(\frac{dW(t)}{dt} \right) \right) \right]^{-1}.$$

In other words, it is the reciprocal of slope of $\ln \left(\frac{dW(t)}{dt} \right)$ when plotted against time. For a perfectly exponential decay of the
85 tracer concentration in the reservoir, the plot of $\ln \left(\frac{dW(t)}{dt} \right)$ vs time will be a straight line, and the slope (the decay timescale) will be equal to both the *e*-folding time and the mean residence time. However, for non-exponential decay, the decay timescale will vary in time. In practice, we calculate the decay timescale via the slope of a best fit line to the natural log of SO₂ mass.

The median decay timescale during the decay period is taken as a measure of the overall behavior and for comparison with other results in the literature. Furthermore, we include a bounds indicating the spread of decay timescales throughout the decay period. In general, the tighter the bounds, the closer the decay is to exponential. Wider bounds are indicative of increased variability and uncertainty, and suggests that a single, calculated e -folding time does not sufficiently capture the true nature of the decay. The lack of consensus on this terminology in the literature adds a layer of complication when comparing results. One of our goals here is to draw attention to this potential source of uncertainty.

2 Data and methods

2.1 Satellite observations

Satellite observations of volcanic SO_2 emissions are provided by both nadir-viewing and limb-sounding instruments (e.g., Carn et al., 2016). Nadir measurements using backscattered ultraviolet (UV) radiation (e.g., OMI and OMPS) measure the total vertical column density (VCD) of SO_2 . They provide good horizontal resolution ($\sim 10\text{--}50$ km) and contiguous, global coverage but no vertical resolution (vertical profile information can sometimes be derived from UV measurements but it is computationally expensive and not a standard product). Nadir observations by infrared (IR) sounders have similar horizontal resolution and can be used to retrieve SO_2 altitude (e.g., Clarisse et al., 2014), but this requires relatively high SO_2 column amounts and hence is problematic for dispersed volcanic plumes. In contrast, limb-sounding instruments using emitted microwave and IR radiation (e.g., MLS and MIPAS) provide vertically resolved SO_2 profiles (with vertical spacing of $\sim 1.5\text{--}3$ km) but they have low horizontal resolution (~ 170 km for MLS and 420 km for MIPAS) and only measure the stratospheric SO_2 contribution to the column.

The retrieval of SO_2 VCD from nadir UV measurements requires an assumed SO_2 vertical profile as input, introducing uncertainty if the assumed profile differs from the actual vertical distribution. However, limb-sounding instruments measure the SO_2 vertical profile directly, thus eliminating some of the uncertainty in SO_2 mass loading inherent to nadir measurements. Furthermore, because limb-sounding instruments detect emitted radiation from a long horizontal (or tangent) path through the atmosphere, they provide greater sensitivity to volcanic SO_2 when the gas is highly dispersed in thin, horizontally extensive layers. Compared to nadir UV measurements, microwave and IR limb-sounders also provide higher sensitivity to SO_2 at very high latitudes.

Nadir observations are therefore optimal for measuring SO_2 mass loading in recently erupted volcanic SO_2 plumes (within hours to a few days after eruption), which are relatively compact and poorly sampled by limb sounders. However, once the SO_2 becomes dispersed in the atmosphere, the greater sensitivity of limb sounders is advantageous for monitoring the decay of stratospheric SO_2 , especially at high latitudes. Eruptions at mid- to high-latitudes typically experience stronger wind shear than tropical eruptions (e.g., due to interaction with the polar jet stream) and hence may have a tendency to disperse more quickly below the detection limit of nadir instruments.

Here, we focus on data from two limb-sounding instruments (MIPAS and MLS), and one nadir instrument (OMI). These instruments are discussed in more detail in the following sections.

2.1.1 MIPAS

The Michelson Interferometer for Passive Atmospheric Sounding (MIPAS) instrument was an atmospheric limb sounder that measured radiation in the region $685\text{--}2410\text{ cm}^{-1}$ via a Fourier transform spectrometer (Fischer et al., 2008). The instrument was on the polar orbiting satellite Envisat and operated from 1 March 2002 until 8 April 2012. During the time period of the retrievals used in this work, the spectral resolution was 0.0625 cm^{-1} , the horizontal resolution was 420 km, and the vertical resolution was 1.5 km (Höpfner et al., 2015). We accessed the data at <https://www.imk-asf.kit.edu/english/308.php> and used the high spectral resolution version of the data. In addition to SO_2 volume mixing ratio, we use retrieved pressure and temperature to convert the volume mixing ratio to mass, as described in later sections. As suggested within the MIPAS data files, we select valid data by only using points where visibility == 1 and akm_diagonal > 0.03.

2.1.2 MLS

The Microwave Limb Sounder (MLS) is an instrument on NASA’s Aura satellite, which launched in July 2004 and has a sun-synchronous orbit (Waters et al., 2006; Schoeberl et al., 2006). The instrument measures thermal emission in the microwave from Earth’s limb and has done so with little interruption from August 2004 to the time of writing (Pumphrey et al., 2015). The retrievals of temperature and SO_2 mixing ratios used in this work are reported on pressure levels with an approximate spacing of 3 km, and the horizontal resolution is approximately 170 km (Livesay et al., 2022). We use Level 2 V5 daily swath SO_2 mixing ratio data, accessed at <https://disc.gsfc.nasa.gov/datasets/ML2SO2005> (Read and Livesay, 2021). This data is obtained via the 240 GHz radiometer on the MLS instrument (Pumphrey et al., 2015). In addition to the SO_2 mixing ratio, this data set reports the temperature at each pressure level, and we use this in our calculation of SO_2 mass and altitude above sea level.

The MLS documentation highlights that the retrieval algorithm can generate negative mixing ratios, and the correct way to deal with these is to average over a sufficiently large horizontal area (Livesay et al., 2022). We apply all of the suggested masking for the data given in Livesay et al. (2022), and we average our data over 10° latitude bands. Even after masking and averaging, negative mixing ratios are prominent in the MLS data, particularly lower in the atmosphere.

2.1.3 OMI

Like MLS, the Ozone Monitoring Instrument (OMI) is also an instrument on NASA’s Aura satellite. With only minor gaps since August 2004, OMI measures ultraviolet and visible nadir solar backscatter (Levelt et al., 2006) and thus does not provide explicit vertical resolution. Here we use the level 2, version 3 stratospheric estimate of SO_2 vertical column density (VCD) (Li et al., 2020). These estimates of VCD are reported in the variable ColumnAmountSO2_STL from the OMI product and are given in Dobson units ($1\text{ DU} = 2.69 \times 10^{16}\text{ molec cm}^{-1}$). We follow the guidelines for flagging erroneous values given in the documentation for the data set (see Li et al. (2020)). OMI’s stratospheric estimate of VCD is derived using an assumed lower-stratospheric SO_2 profile with a center of mass at 18 km. Note that results using the OMI output in ColumnAmountSO2_TRU, which assumes a center of mass at 13 km, had little impact on our results. See Li et al. (2017) for more details on the retrieval algorithm.

2.2 Model Data

We compare the satellite data to model output from the Whole Atmosphere Community Climate Model version 6 (WACCM6), which is a component of the Community Earth System Model version 2 (CESM2). Data for 1980–2014, which we use here, were initially published in Gettelman et al. (2019). See this paper for a thorough overview on the details of the model. Throughout the paper, we refer to the model output simply as WACCM.

The horizontal resolution of the model is 1.9° latitude by 2.5° longitude. There are 88 levels in the vertical, extending up to approximately 140 km above the surface of the Earth. Vertical resolution in the upper troposphere and stratosphere is 1–2 km. All major volcanic eruptions from 1980 to 2014 are included in the model. The chemical mechanism includes a detailed representation of stratospheric chemistry, and importantly, the oxidation of stratospheric SO_2 is driven by the gas-phase reaction with OH only. Thus, the model provides useful baseline for determining other potential oxidation pathways in the observations.

2.3 Calculation of SO_2 mass

The method used to calculate the SO_2 stratospheric burden depends on the units of the initial SO_2 data. When starting with SO_2 volume mixing ratio (as is the case for MIPAS, MLS, and the WACCM data), we first convert the volume mixing ratio to a mass mixing ratio using the molar masses of SO_2 and air. For every vertical profile, pressure and temperature from the respective product are then used to calculate the air density at each pressure level (using the ideal gas law). Multiplying the air density with the mass mixing ratio yields at the density of SO_2 at each pressure level.

The MIPAS data is reported on an altitude coordinate with a spacing of 1 km, and the MLS and WACCM data are reported on a pressure coordinate. In order to compare the data sets, we interpolate the MLS and WACCM data to the altitude coordinate from MIPAS.

For the MLS data, this is done in several steps. At every vertical profile, we first calculate the change in altitude Δz_i between successive points p_i and p_{i+1} on the MLS pressure coordinate using hydrostatic balance:

$$\Delta z_i = z_{i+1} - z_i = \int_{p_i}^{p_{i+1}} -\frac{1}{g\rho_{\text{air}}} dp \quad (1)$$

In practice, we evaluate this integral discretely and assume that the density ρ_{air} varies linearly from $\rho_{\text{air}}(p_i)$ to $\rho_{\text{air}}(p_{i+1})$. The maximum value in the MLS pressure coordinate is 1000 hPa. By assuming that this pressure corresponds to an altitude of 0 km, we can use equation (1) to calculate the altitude of every pressure level of every vertical profile in MLS. With this, we then linearly interpolate each vertical profile from MLS to the altitude coordinate of the MIPAS data.

For the WACCM data, the model output geopotential height is used for the interpolation to the MIPAS height grid.

Once the data is on an altitude vertical coordinate, we integrate in the vertical and horizontal to get the total mass of SO_2 . As we are interested in the oxidation of SO_2 as a function of height, we group our data into three height bins used by Höpfner et al. (2015) (10–14 km, 14–18 km, and 18–22 km) and vertically integrate in each height bin. We also calculate the total SO_2 mass in the upper troposphere/lower stratosphere by integrating from 10 to 22 km. Given the variation in tropopause height with

185 latitude, the 10 to 14 km and 14 to 18 km layers won't necessarily be entirely in the stratosphere in low latitudes (Hoffmann and Spang, 2022). However, we use the vertical divisions here for consistency with past work, and future work could consider a division based on tropopause height.

Following Höpfner et al. (2015), for the horizontal integration, we group our data into 10° latitude bands, take the mean of the vertically integrated SO₂ data falling in each band, and multiply by the area of the respective latitude band. We perform
190 this calculation for each of the three height bins to find the mass of SO₂ in each height bin within each latitude band. Finally, for each height bin, we sum up the mass of SO₂ in all of the bands that were clearly affected by the volcanic eruption.

The SO₂ mass from OMI is calculated by horizontally integrating the reported vertical column density values. The horizontal integration is the same as that described for the MLS and MIPAS data.

2.4 Calculation of the decay timescale

195 We determine the decay timescale by first calculating the perturbation due to the eruption from a background SO₂ level that occurs in the absence of any volcanic influence. We determine the background for each height bin and 10° latitude band. The time period that defines the the non-volcanic background varies by eruption and product, but in general, we select a background such that the SO₂ perturbation decays to 0 given enough time. For some eruptions and products, care needs to be taken to select an appropriate background; for example, there is a signal from the eruption of Okmok in the MIPAS data prior to the Kasatochi
200 eruption, and thus we select a background period long after the influence of either eruption is seen in the time series (see Fig. 2f). For the MLS data, we also remove the apparent seasonal cycle for each height bin (if the cycle is present; see Sect. 3.2 for more details on how we remove the seasonal cycle, and the implications of doing so).

Once the volcanic SO₂ perturbation is isolated, we then determine the decay timescale by fitting a best fit line of the form (using the notation of Höpfner et al. (2015))

$$205 \quad M_{\Delta h_i}(t) = M_{\Delta h_i}(t_0) \exp\left(-\frac{t - t_0}{\tau_{\Delta h_i}}\right), \quad (2)$$

where $M_{\Delta h_i}$ is the mass of SO₂ in height bin Δh_i , $\tau_{\Delta h_i}$ is the decay timescale in that bin, and t_0 is the start of the window used for the calculation. Volcanic plumes are known to have strong impacts on the local chemical environment in the stratosphere, by, for example, altering OH concentrations, photolysis rates, and water vapor content (McKeen et al., 1984; Carn et al., 2022; Glaze et al., 1997). These impacts can in turn influence the oxidation rate of SO₂, and in particular lead to variations
210 in the decay timescale during the decay of the SO₂ burden. Thus, in order to assess this potential variability, we perform the calculation over a series of moving windows in time. We use windows of three lengths: 15, 20, and 25 days. For each window length, the calculation is repeated for five different windows with the first day in each window spaced five days apart. The start of the first window coincides with when the SO₂ mass begins to decline. When the SO₂ perturbation decays in a period shorter than five windows, we adjust the number of windows appropriately. Figure 1 illustrates the way in which the windows
215 are varied to calculate the decay timescale.

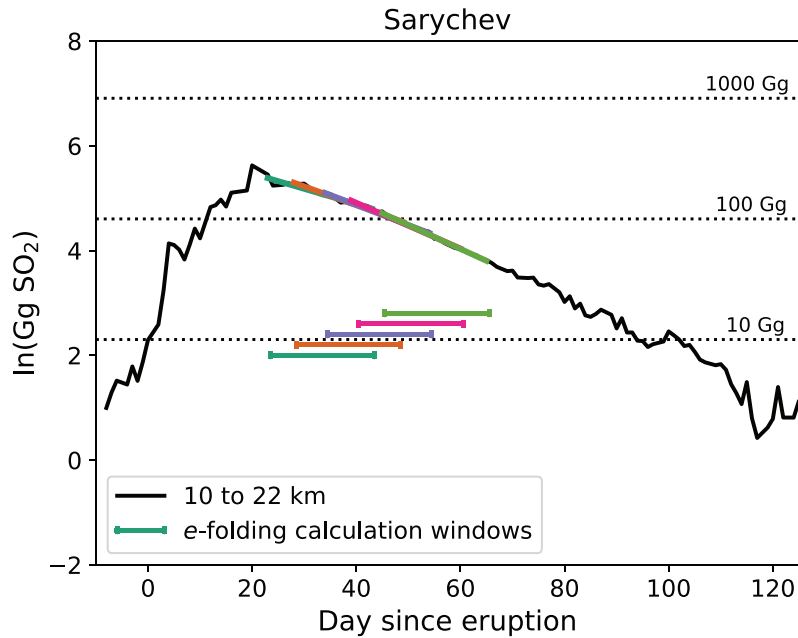


Figure 1. Visual example of the windows used to calculate the decay timescale throughout the decay period. This plot shows the SO_2 mass after the 2009 Sarychev eruption between 10 and 22 km from MIPAS (solid black line). The colored lines are linear fits of the curve during different periods of the decay, as indicated by the horizontal line of the same color below the black curve. The window length in this example is 20 days.

The decay timescale collected from all the windows (all lengths and times) give a sense of the total variability of the oxidation rate of the volcanic SO_2 . The median and 5th and 95th percentiles are used to quantify the spread. Note we use the median, as opposed to the mean, to limit the influence of the tail towards long timescales.

2.5 Calculation of total stratospheric SO_2 burden

220 We calculate the mass of SO_2 reported in Table 2 using the time series shown in Fig. 5, Fig. B1, and Fig. B2. For MLS and MIPAS, these are the time series of SO_2 in the 10 to 22 km height bin. For each volcano's time series, we take the difference between each successive data point (i.e. `np.diff`) and sum the positive values of the resulting array during the eruption period for each volcano. We base the eruption period based off the volcanic activity reports provided by Venzke (2024). In the event that the maximum SO_2 mass occurs outside of the eruption period (e.g. Kasatochi only erupted for two days, but peak

225 SO_2 in the MIPAS data set occurs after this), we sum the positive values of the differences until the day of maximum SO_2 .

As discussed in more detail in Sect. 5, this method proves inadequate for accurate mass burden estimations. This is particularly true for MIPAS, as the spectral bands measured by MIPAS saturate at high SO_2 concentrations. The inclusion of it in this

paper provides a contrast compared to total burden estimates derived from SO₂ *e*-folding time estimates (e.g., Höpfner et al., 2015; Pumphrey et al., 2015).

230 3 Determining the SO₂ decay rate in limb-sounding observations

3.1 Comparing MIPAS and MLS

We use vertically resolved retrievals of SO₂ from two limb-sounding products, the Microwave Limb Sounder (MLS) and the Michelson Interferometer for Passive Atmospheric Sounding (MIPAS) (see Sect. 2 for more details). Both instruments have high temporal and near global coverage, making their observations suitable for assessing the decay of SO₂ both vertically and
235 horizontally as the volcanic plume is mixed and dispersed following the eruption (Höpfner et al., 2015). While past work has analyzed SO₂ retrievals in each product individually (for MLS see Pumphrey et al. (2015); for MIPAS see Höpfner et al. (2015); Günther et al. (2018)), to our knowledge this is the first direct comparison of their vertically resolved SO₂ measurements. MLS is in a decaying orbit that is likely to end very soon, while MIPAS operated from 2002 through 2012. We focus our analysis on large (greater than 1 Tg SO₂ emitted, Carn et al. (2016)) eruptions covered by both instruments.

240 Figure 2 shows the observations from MLS and MIPAS from 2008. While there were a few smaller eruptions in that year, by far the most significant was the eruption of Kasatochi on August 7, 2008 (set to day 0 in the figure and indicated with a vertical dashed line). An island volcano in the Aleutian Islands (52.12°N, 175.51°W), Kasatochi injected an estimated 2 Tg SO₂ into the atmosphere, with the plume reaching a height of 15 km (Carn, 2024). The top row of Fig. 2 shows the SO₂ daily mean volume mixing ratio (in ppb) in the lower stratosphere as a function of time and latitude retrieved from MLS (left) and MIPAS
245 (right). MLS data is reported on a pressure vertical coordinate, whereas MIPAS has elevation as the vertical coordinate. The data plotted in Fig. 2a and 2b shows the daily mean volume mixing ratio at a similar distance above the surface of the Earth prior to any sort of interpolation or integration. This highlights the inherent differences in the underlying data between the two products. While the eruption is clearly visible in both data sets, as indicated by the elevated SO₂ shortly after the eruption (day 0), the mixing ratios reported by MLS are negative for much of the year, whereas in MIPAS they are positive and much closer
250 to 0 (compare Fig. 2a to Fig. 2b). Negative mixing ratios are unphysical; negative bias is noted in the documentation for the dataset (Livesay et al., 2022), and are perhaps due to interference from other gases (Pumphrey et al., 2015).

Figures 2c and 2d show the total SO₂ mass between 40°N and 90°N for three different height bins, 10 to 14 km, 14 to 18 km, and 18 to 22 km (see Sect. 2.3 for more details). We choose these bins to be consistent with those used in Höpfner et al. (2015). While the Kasatochi eruption is clearly visible in Fig. 2c, the MLS data in the 10 to 14 km bin shows large
255 negative masses throughout the entire year. Additionally, the MLS mass in the 10 to 14 km and 14 to 18 km bins feature a seasonal cycle with an amplitude much larger than what is expected for background stratospheric SO₂ (Pumphrey et al., 2015; Höpfner et al., 2013). Pumphrey et al. (2015) also noted a seasonal cycle in MLS SO₂ when using version 2 of the data and attributed it to interference from O₃ and nitric acid (HNO₃), as these species exhibit strong emission lines in the passband of the radiometer used to measure SO₂. The implications of this seasonal cycle are discussed further in Sect. 3.2. We also note
260 that at low altitudes, the noise of the MLS data likely arises at least in part from the fact that microwave emission lines—and

thus the signal received by the instrument—are subject to pressure broadening. This may explain the reduction of noise seen in the 18 to 22 km height bin in MLS, as the impacts of pressure broadening decrease with height (Pierrehumbert, 2010).

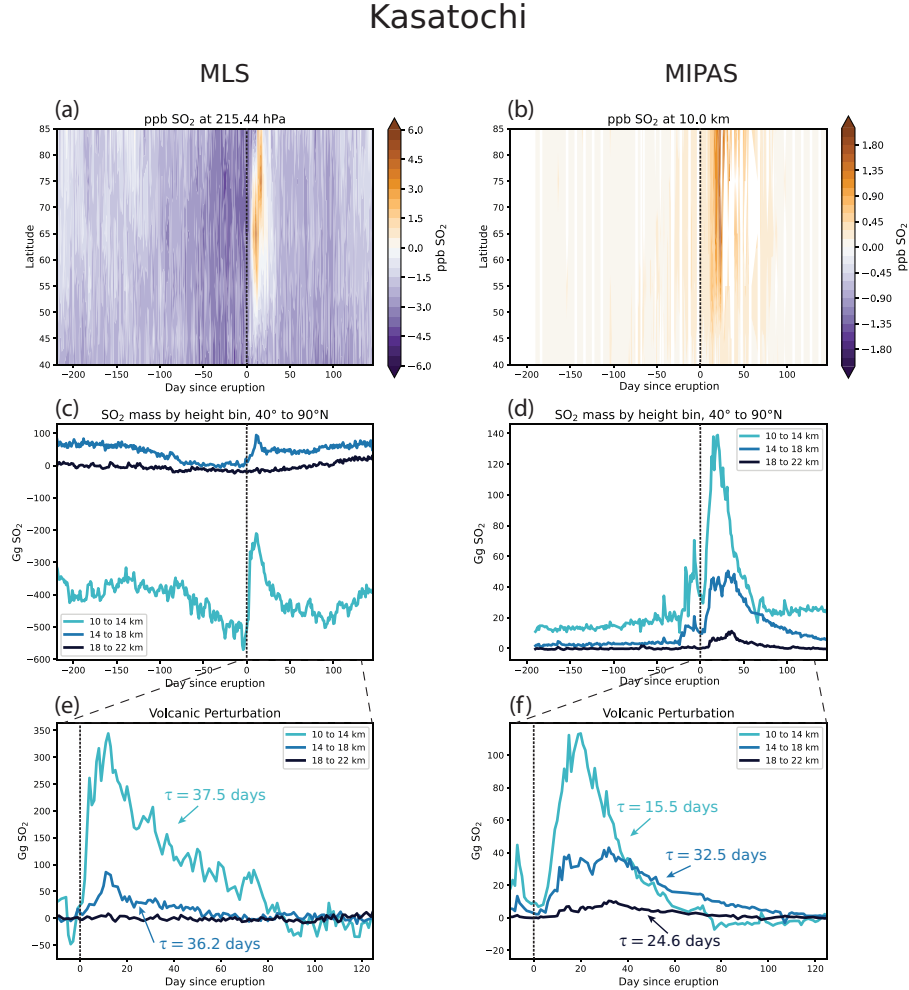


Figure 2. Comparison of MLS and MIPAS observations during 2008 and the Kasatochi eruption. MLS observations are shown in the left column, and MIPAS observations are shown in the right column. In all panels “day 0” corresponds to the start of the Kasatochi eruption (August 7, 2008; Carn (2024)), as denoted by the vertical dashed line. The top row shows the volume mixing ratio in ppb as a function latitude and time for the (a) MLS and (b) MIPAS at comparable elevations on the native height coordinate of the respective observational product. Note the different colorbar scale between the two panels. The mixing ratio values have been averaged on each day in 10 degree latitude bands, but are otherwise unmodified from those reported in the respective data sets. The middle row shows the mass of SO_2 in Gg over the course of the year in the 10 to 14 km, 14 to 18 km, and 18 to 22 km height bins. The bottom row shows the perturbation of SO_2 in each height bin resulting from the Kasatochi eruption and the associated decay timescales times. There was no significant volcanic signal for the MLS data in the 18 to 22 height bin, and thus no values is reported. Note that in panels (c) and (e), the MLS data has been interpolated to the height coordinate of MIPAS.

Compared to MLS, the MIPAS data is easier to interpret. There is no significant seasonal cycle in the background, and the large injection of SO₂ due to Kasatochi is clearly seen (Fig. 2d). Note that the spike in SO₂ at lower elevations prior to the Kasatochi eruption is likely due to the more minor eruption of Okmok in Alaska on July 12, 2008 (53.42°N, 168.13°W, 0.15 Tg SO₂ emitted; Carn (2024)). The signal from this eruption is not clear in the MLS data.

However, the peak perturbation of SO₂ due to the eruption is roughly a factor of 3 greater in the MLS data than in the MIPAS data; this is because MIPAS does not fully sample the volcanic plume at its most dense. As noted by Höpfner et al. (2015), the difference between MIPAS and MLS in the initial part of the plume's dispersion and decay is thought to be the result of both interference from volcanic particles and saturation in the spectral lines measured by the MIPAS instrument in the presence of very high SO₂ concentrations (such as those seen immediately after a large eruption). Thus, there are advantages and disadvantages to both satellite sensors in this application. MLS provides a better measurement of the peak input of SO₂ relative to MIPAS data. However, despite these shortcomings, the decay of the SO₂ mass is clearly seen in MIPAS once the initial plume has dispersed enough for the signal to reach the instrument, i.e., when the SO₂ radiance is no longer saturated. Furthermore, it is worth noting that the magnitude of the MLS values in Version 5 of the data are roughly a factor of 4 smaller than those in Version 2 reported by Pumphrey et al. (2015). The reason for this remains unclear, and no explanation or documentation for this difference was found in the literature.

We performed the same evaluation for the eruptions of Sarychev in 2009 (48.01° N, 153.20° W, 1.2 Tg SO₂ emitted) and Nabro in 2011 (13.370° N, 41.70° E, 1.975 Tg SO₂ emitted), the two other major eruptions covered by both MLS and MIPAS (Carn, 2024). The results for Sarychev and Nabro are shown in Fig. A1 and Fig. A2, respectively. In both cases we see the negative mixing ratios and masses in the lower two height bins in the MLS data. For Sarychev, the magnitude of the perturbation is comparable in MLS and MIPAS, with MIPAS showing around 100 Gg more mass in the 10-14 km height bin (Fig. A1e and Fig. A1f). Previously, Höpfner et al. (2015) indicated that MLS displayed more mass than MIPAS after Sarychev (their Fig. 13), and the change that we see here may be due to differences between Version 2 and Version 5 of the MLS data. Furthermore, in the case of the Nabro eruption, the MLS data in the 10 to 14 km height bin does not show any signal of the eruption. In the MIPAS data for Nabro, there is an upward trend in SO₂ in the 10 to 14 km bin prior to the eruption. This could possibly be linked to upward transport of SO₂ in the Asian summer monsoon (Neely et al., 2014), as Nabro is a tropical eruption, and thus the latitude bands influenced by the eruption are also more likely to be influenced by the monsoon.

3.2 Background seasonal cycle in the MLS data

As shown in Fig. 2c, there is an apparent seasonal cycle in the mass of SO₂ measured by MLS in both the 10 to 14 km and 14 to 18 km height bins that is not realistic (Pumphrey et al., 2015; Höpfner et al., 2013). While Pumphrey et al. (2015) speculate that this is due to leakage of information from O₃ and HNO₃, it is not obvious what the shape of the seasonal cycle should be, and we incorporate the resulting decay timescales corresponding to different possible seasonal cycles into an overall estimate of uncertainty in the decay timescale.

In order to sample possible shapes of the seasonal cycle, at each height bin we first take a 35 day running mean of the MLS time series with the non-volcanic background removed (see Sect. 2.4 for details on how we define the non-volcanic

background). We then replace the values from day M to day N (where we vary M from -5 to 1 and N from 50 to 105 in the case of Kasatochi; we adjust the range of values for M and N for each eruption so that the seasonal cycles are within reason) with a line between the SO_2 mass on day M and the SO_2 mass on day N . In other words, M and N define the section that we
 300 remove from the time series prior to determining the seasonal cycle, and varying these parameters results in different cycles. We then use a discrete fast Fourier transform to filter out the high frequency variability, leaving us with the seasonal cycle. Once we determine this, we subtract out the seasonal cycle from the time series.

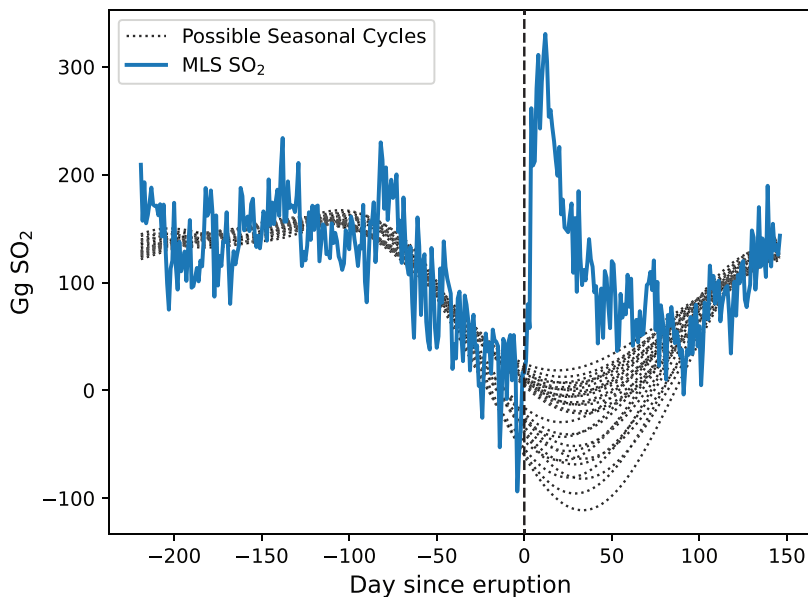


Figure 3. Possible background seasonal cycles in the MLS data. The blue curve shows MLS mass in the 10 to 14 km height bin following Kasatochi. Note that a constant has been subtracted from the time series shown in Fig. 2c so that the curve is roughly zero immediately before the eruption. The dotted black lines show possible seasonal cycles that could have potentially occurred in the absence of the Kasatochi eruption. As in Fig. 2, day 0 corresponds to the eruption of Kasatochi and is indicated by the dashed vertical line.

Figure 3 demonstrates the possible seasonal cycles in the MLS data derived using the method outlined above. The figure uses data from the Kasatochi eruption in the 10 to 14 km height bin, but the resulting spectrum of seasonal cycles is similar
 305 across eruptions and height bins. The presence of the seasonal cycle leads to range of possibilities in the shape and and decay of the volcanic perturbation, and this ultimately translates into greater uncertainty when deriving a decay timescale from the MLS data (see Sect. 3.3 and Table 1 for more details).

3.3 Comparing SO₂ decay timescales for different volcanoes

We compare decay timescales and their estimated uncertainties for MLS and MIPAS in Table 1 for the three largest eruptions during the time period covered by both products: Kasatochi in 2008, Sarychev in 2009, and Nabro in 2011. These eruptions all occurred in local summer. However, Kasatochi and Sarychev are both high latitude, northern hemisphere eruptions, whereas Nabro is a tropical eruption. Differences in tropopause height, OH concentrations, and local dynamics between the tropics and higher latitudes make comparisons between Nabro and the high latitude eruptions difficult. In particular, the tropopause in the tropics during the local summer is around 16 km, whereas that for the high northern hemisphere latitudes is closer to 11 km (Hoffmann and Spang, 2022). As such, the majority of the three layers considered in this analysis are likely to be in the stratosphere for the Kasatochi and Sarychev eruptions. After the Nabro eruption, likely only the 18 to 22 km layer was initially fully in the stratosphere; however, the plume was quickly advected to higher latitudes—where the tropopause is lower—by the Asian Monsoon anticyclone in just a few days (Clarisse et al., 2014). There are large vertical gradients in H₂O and therefore OH at the tropopause (Milz et al., 2005; Jiang et al., 2015), and thus whether a layer falls above or below the tropopause will potentially significantly impact SO₂ removal times. A more precise treatment of calculating SO₂ decay based on whether a measurement falls above or below the tropopause is left for future work.

Despite this variability between different eruptions, the comparison between the observational products for a given eruption is illustrative of the uncertainty associated with each product. These values are summarized in Table 1. Values in bold indicate the median decay timescale from a collection of values calculated by varying the time window used for the linear fit of the exponential decay. Our uncertainty values (shown in parentheses) are the 5th and 95th percentiles, which gives a sense of the variability in perturbation decay rate depending on how it is calculated. See Sect. 2.4 for more details on this calculation. Given the range of methods used to calculate the decay rate of volcanic SO₂ in the literature (e.g., Höpfner et al., 2015, Table 3 and references therein), our intent with these uncertainty bounds is to demonstrate how a spread in the decay timescale can arise by changing the time period used for the calculation. Plume-induced changes in chemistry is one potential mechanism driving this behavior (McKeen et al., 1984). Vertical transport by the background circulation of the stratosphere is unlikely to have a significant impact on our results as it is quite slow—on the order of tenths of mm s⁻¹ or hundredths of km day⁻¹—compared to the timescale of SO₂ decay (Butchart, 2014). Khaykin et al. (2022) did report an unusual radiative self-lofting of the Raikoke volcanic plume in 2019; the observed vertical ascent for this eruption was upwards of 2 mm s⁻¹ (0.17 km day⁻¹) and would be fast enough impact our results. This phenomenon has not been noted for any of the volcanoes examined here, though it is a potential source of uncertainty and worth examining in future work.

In general there is greater uncertainty in the MLS-derived decay timescales, in part because the ambiguity of the seasonal cycle present in the data is compounded with the variability that arises in changing the decay time window. The volcanic signals in the MIPAS data are clearer, and uncertainty in the decay timescale then stems from uncertainty in the exponential fit of the SO₂ mass following the eruption alone. These results suggest that MIPAS, as an infrared sounder, can provide better estimates of the decay timescale throughout the depth of the atmosphere compared to MLS. However, we emphasize again that MIPAS does not capture the peak input as well as MLS.

Table 1. Comparison of calculated decay timescales between this work and Höpfner et al. (2015). For the MIPAS, MLS, and WACCM rows, bold values are the median decay timescale, and the values in parentheses are the 5th and 95th percentiles. See Sect. 2.4 and Sect. 3.2 for more details on how these are calculated. MIPAS-derived values from Höpfner et al. (2015) are indicated by MIPAS H2015. Dashes indicate a lack of a clear signal for that product at that height bin.

Kasatochi 2008			
	10 to 14 km	14 to 18 km	18 to 22 km
MIPAS (this study)	15.5 (11.9, 17.9)	32.5 (30.0, 37.9)	24.6 (19.7, 33.0)
MIPAS (H2015)	14 (13, 15)	23 (18, 28)	32 (28, 36)
MLS	37.5 (22.4, 67.1)	36.3 (12.8, 55.8)	—
WACCM	17.5 (14.9, 21.7)	23.8 (15.1, 29.3)	22.5 (19.6, 23.4)
Sarychev 2009			
	10 to 14 km	14 to 18 km	18 to 22 km
MIPAS (this study)	25.4 (22.5, 36.6)	30.7 (23.6, 60.5)	38.4 (26.4, 65.9)
MIPAS (H2015)	15 (13, 17)	25 (24, 26)	38 (36, 40)
MLS	10.7 (6.6, 27.2)	22.0 (10.6, 32.9)	—
WACCM	10.4 (10.1, 12.1)	14.1 (13.6, 20.8)	—
Nabro 2011			
	10 to 14 km	14 to 18 km	18 to 22 km
MIPAS (this study)	16.6 (10.4, 30.1)	29.5 (24.8, 37.2)	35.6 (32.5, 56.4)
MIPAS (H2015)	11 (8, 14)	23 (21, 25)	27 (26, 28)
MLS	—	26.5 (15.4, 66.8)	—
WACCM	9.2 (6.3, 17.4)	10.4 (10.0, 10.6)	19.3 (17.8, 26.2)

Table 1 also compares our calculated decay timescales with those calculated by Höpfner et al. (2015) using MIPAS retrievals. Note that Höpfner et al. (2015) refers to these values as “lifetimes” and calculates them by varying the window for the fit of a straight line to the natural logarithm of the SO₂ mass. They use longer windows (around 30 days) than we use here. Their values show a clear increase of decay timescale with height, which is generally also seen in our results (with the exception of

some of the values for Kasatochi). Additionally, the 5th to 95th percentile ranges reported here are large, and in nearly all cases the results reported in Höpfner et al. (2015) fall within the ranges given here.

We also compare the observations from the satellite products with output from the WACCM model (Gettelman et al., 2019) for these three eruptions (see Table 1 and Fig. 4). The WACCM model only incorporates gas-phase oxidation of SO₂ and thus provides a useful baseline to use in comparing the real world measurements.

The expected increase in decay timescale with height based on gas-phase oxidation alone is most obvious in the Nabro eruption for the WACCM data. In the satellite data, this is most clearly seen for MIPAS in the Sarychev and Nabro eruptions. The median WACCM decay timescales (in which OH is the only oxidative agent) tend to fall below the median decay timescales from the satellite observations. The one notable exception is the Sarychev eruption in the 10 to 14 km height bin, where the median decay timescale between MLS and WACCM are quite close at around 11 days. However, it is challenging to make further conclusions from this alone due to the previously discussed issues in the MLS data. For Nabro, the median decay timescale from WACCM is outside the uncertainty range of the observations for all three height bins. There are a variety of potential causes for the discrepancy between the model and observations. One reasonable issue could be differences in water vapor and between the model and observations. However, comparisons between WACCM and MLS water vapor generally show strong agreement, and it is not clear that this should be the main culprit (Froidevaux et al., 2019). Model treatment of the interplay between particle scattering and photolysis inside the volcanic plume initially after the eruption could also play a role, but we do not explore this discrepancy further here.

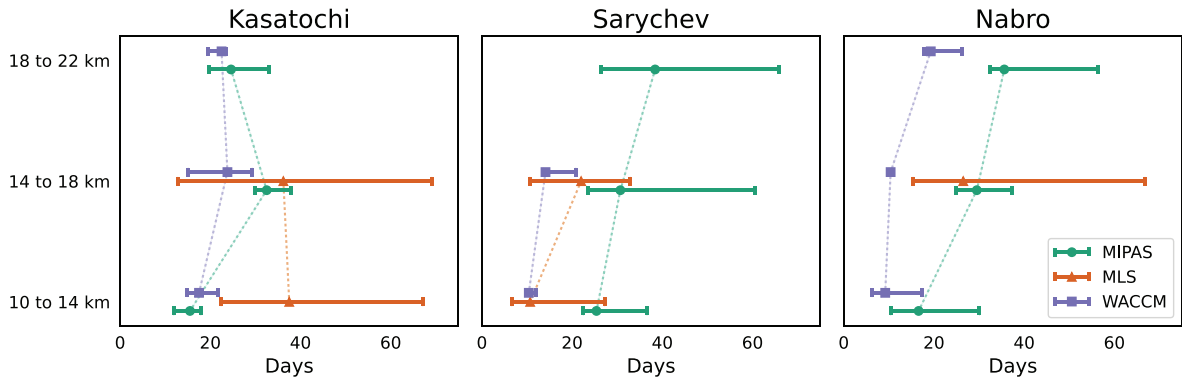


Figure 4. SO₂ decay timescale in the 10 to 14 km, 14 to 18 km, and 18 to 22 km height bins for Kasatochi 2008, Sarychev 2009, and Nabro 2011. Markers indicate the median decay timescale, and error bars show the 5th and 95th percentile. For a description of how the median and error bars are calculated, see Sect. 2.4 and Sect. 3.2. A missing line for a given product and height bin indicates the lack of a sufficient signal for the calculation.

While the observed median decay timescale is generally on the order of 10 to 40 days, there is a wide range in values across the different products and height bins. The uncertainty in obtaining the decay timescale in the WACCM model is quite low, as it only arises due to uncertainty in the fitting of the decay. This decay is—as one would expect for model

output—quite clear and easy to quantify; moreover, the tight bounds suggest that the removal of SO₂ in the model is indeed exponential. However, uncertainties in the process understanding of OH chemistry in the model are likely to be a larger source of error; this likely also limits the interpretation of any discrepancies in data/model comparisons. While MIPAS displays smaller uncertainties than MLS (Table 1), on the whole the observations have a much wider range of decay timescale. For
370 example, the observational decay timescales in the 10 to 14 km height bin for Sarychev span from roughly 36 to under 7 days. For Kasatochi, the observational decay timescales in the 10 to 14 km height bin range from over 67 to under 12 days. It is also worth noting that previous estimates of decay timescales (derived using a variety of satellite products) for these eruptions do fall within the (rather large) uncertainty ranges shown here (see Höpfner et al. (2015) Table 3 and references therein).

4 Decay timescales for total SO₂ between 10 and 22 km and comparisons with OMI

375 We compare the results from MLS, MIPAS, and WACCM with SO₂ retrievals from the Ozone Monitoring Instrument (OMI). OMI is a popular choice in recent work examining the decay of SO₂ following eruptions (e.g., Carn et al., 2022; Zhu et al., 2020; Krotkov et al., 2010), and we include an analysis of it here for a comparison of how limb-sounders and nadir-sounders capture the removal of volcanic SO₂. Note that OMI is just one of several nadir-sounding instruments that measure SO₂, and a detailed comparison with other instruments (such as AIRS) is left to future work.

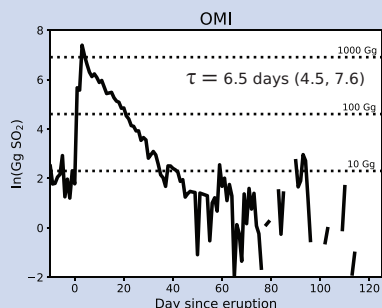
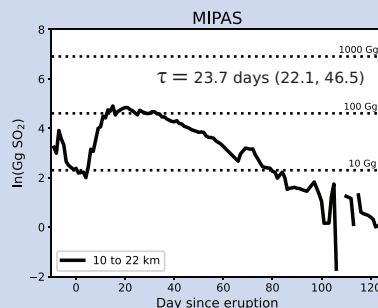
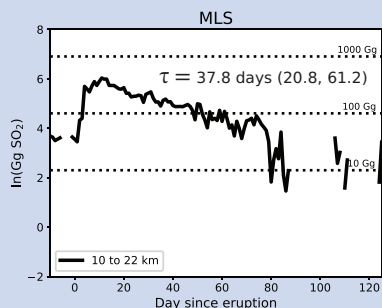
380 Unlike MLS and MIPAS, OMI is a nadir-viewing instrument that measures backscattered ultraviolet and visible radiation (Li et al., 2017). OMI reports the vertical column density of SO₂ and lacks the vertical resolution provided by MLS and MIPAS. However, OMI is able to provide estimates of SO₂ within different vertical layers of the atmosphere by assuming a vertical SO₂ profile and iteratively adjusting it to fit the observed backscattered radiation. Here we use the stratospheric data set from OMI, which is intended for studying explosive volcanic eruptions. For more details see Sect. 2.1.3 and Li et al. (2017).

385 Since OMI only provides a total column perspective of the stratosphere, we compare the decay of the volcanic perturbation in OMI with that between 10 and 22 km in the MLS, MIPAS, and WACCM products. Figure 5 shows this comparison for the Kasatochi eruption. The OMI-derived decay timescale of 6.5 days is substantially faster than that in either of the other two satellite products or the WACCM model. Indeed, the 5th and 95th percentile range (4.5 to 7.6 days) for OMI does not overlap at all with this percentile range in any of the other products. Other published estimates of the OMI-derived decay timescale after
390 Kasatochi are also similarly fast (Krotkov et al. (2010) report a time of 8 to 9 days).

This difference in the OMI decay timescale also arises for the Sarychev and Nabro eruptions (Fig. B1 and Fig. B2, respectively). For both eruptions, the OMI value is much faster than either of the other three products, and there is none-to-minimal overlap between the uncertainty ranges of OMI and the other products. There are a couple possible explanations for this. While the OMI data used here is designed to give an estimate of SO₂ mass in the stratosphere (Sect. 2.1.3), there is potential for tro-
395 pospheric SO₂ to influence this measurement. Tropospheric SO₂ will get removed much quicker than that in the stratosphere, and could be skewing the decay rates reported here. Additionally, there is a known bias in the OMI data due to the limited sensitivity of nadir instruments as the plume disperses (see Sect 2.1). Both of these should be considered more carefully when analyzing OMI SO₂ following an eruption.

Kasatochi

Observations



Model

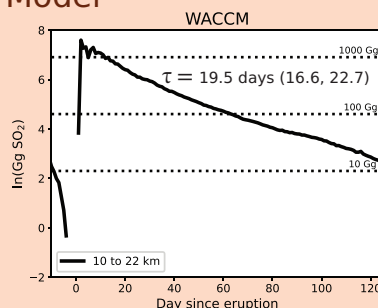


Figure 5. Comparison of stratospheric decay timescales for the 2008 Kasatochi eruption. Satellite products are highlighted in blue and the WACCM model in orange. For comparison with the total column stratospheric values from OMI, SO₂ masses for MLS, MIPAS, and WACCM, are calculated by vertically integrating from 10 to 22 km. For each product the median and 5th and 95th percentile (in parentheses) decay timescales are reported. Percentile ranges are derived using the method outlined in Sect. 2.4.

As an aside, we also comment on the differences between the model and MIPAS for the three eruptions. In the Kasatochi eruption, the discrepancy in the 10 to 22 km decay timescale between the model and MIPAS is much less than the other two eruptions (see Fig. 5, Fig. B1, Fig. B2). One plausible explanation for this is that the model puts a significant fraction of the SO₂ from Kasatochi into the 14 to 18 km height bin, whereas for Sarychev and Nabro, there is relatively more mass in the 10 to 14 km height bin (Fig. S2). As OH decreases with height in the model, this would lead to slower (and thus closer to MIPAS) decay times for the Kasatochi SO₂ when the larger vertical column is considered.

5 Estimating the stratospheric SO₂ burden

In addition to understanding the chemical fate of volcanically-emitted SO₂, quantifying the total stratospheric burden of SO₂ is key for understanding the potential climate and chemical impacts of volcanoes (Schmidt et al., 2018; Solomon et al., 1998).

Carn et al. (2016) provides a review of total SO₂ mass loading from volcanic eruptions occurring in 1978 through 2014. These values are largely derived from nadir instruments (i.e. TOMS, OMI, IASI) and are often used as the standard reference for
410 volcanic SO₂ mass loading. See Carn (2024) for an updated data set through 2024.

The eruptions analyzed in this work (Kasatochi 2008, Sarychev 2009, and Nabro 2011) feature a high plume height and high VEI, which allowed them to inject upwards of 1 Tg into the stratosphere (Carn, 2024; Carboni et al., 2016). Table 2 compares the SO₂ stratospheric mass loading for Kasatochi, Sarychev, and Nabro derived from satellite observations in this study with the values reported by Carn (2024). The masses calculated in this study are given by the total increase in SO₂ between the
415 initial eruption and the decay period. More details are given in Sect. 2.5. The values reported by Carn (2024) stem from a variety of satellite products and studies, and we only include SO₂ that reached the stratosphere. See Carn et al. (2016), Mills et al. (2016), and the documentation for Carn (2024) for references and further discussion on the total burden of volcanic SO₂ from these eruptions.

Table 2. Estimated total SO₂ mass emitted into the stratosphere. Values from Höpfner et al. (2015) are indicated by H2015, and those from Pumphrey et al. (2015) are indicated by P2015.

Kasatochi 2008	
	Mass SO ₂ (Gg)
MIPAS (this study)	115
MIPAS (H2015)	899±154
MLS (this study)	440
MLS (P2015)	1350±38
OMI (this study)	1642
Carn (2024)	2000

Sarychev 2009	
	Mass SO ₂ (Gg)
MIPAS (this study)	210
MIPAS (H2015)	1473±299
MLS (this study)	221
MLS (P2015)	1160±180
OMI (this study)	232
Carn (2024)	1200

Nabro 2011	
	Mass SO ₂ (Gg)
MIPAS (this study)	172
MIPAS (H2015)	539±117
MLS (this study)	812
MLS (P2015)	543±45
OMI (this study)	748
Carn (2024)	1975

The masses calculated using the method presented in this study are generally much lower than those given by Carn (2024), and, with the exception of Sarychev, there is limited agreement between the observational products. While our method avoids the uncertainty associated with using decay timescales to determine total mass burden, we don't find it adequate for an accurate determination of the total mass. This is particularly true of MIPAS due to its previously mentioned shortfall: it underestimates the total amount of SO₂ present at the start of the eruption when the plume is dense.

The SO₂ masses reported in Carn (2024) are based on total column data from nadir instruments. Whether the lower MIPAS and MLS SO₂ masses in some eruptions reflect fractional stratospheric inputs or are biased due to limitations of sampling by limb-sounding instruments would be a subject for future research; our main focus here is on the decay times of the stratospheric inputs from the indicated eruptions, and we comment on the implications of such information for determining the total stratospheric mass burden.

Previous estimates of total SO₂ burden using MLS and MIPAS were presented by Pumphrey et al. (2015) and Höpfner et al. (2015), respectively. They estimated the mass of SO₂ immediately after the eruption by fitting an exponential curve to the decay of SO₂. The mass at $t = 0$ is then taken to be the total SO₂ emitted by the volcano. While this method has generally led to good results for MIPAS and MLS when compared to other estimates, the final value will be sensitive to how the exponential fit is calculated. As discussed previously, there is wide variability in the decay timescale depending on how it is calculated (e.g. Fig. 5), and this directly translates to uncertainty in the mass loading. The method we use here simply adds up the positive SO₂ perturbations following the eruption. This avoids the uncertainty involved with quantifying the decay timescale and illustrates how these different satellites capture the peak SO₂.

The values reported here, with the exception of OMI during the Kasatochi eruption, are not high enough to account for the observed aerosol loading and radiative forcing following the eruptions (Schmidt et al., 2018). However, despite the noise and interference issues, MLS does get closer to the expected mass burden than MIPAS, particularly for Kasatochi and Nabro.

Future work on determining the stratospheric SO₂ burden from volcanoes should consider the uncertainty in the decay timescale when using the fit of an exponential decay. Furthermore, our results indicate that simply summing the positive SO₂ perturbations from a volcano is not sufficient for getting an accurate mass burden in the data sets analyzed here.

6 Discussion and conclusion

Quantifying the total input and decay timescale of SO₂ is a key step in understanding the chemical fate of volcanically-emitted SO₂ in the stratosphere. In this work we utilize a combination of satellite products and a coupled chemical-climate model to analyze the decay of the SO₂ perturbation from the three largest eruptions (more than 1 Tg SO₂ emitted) between 2004 and 2012: Kasatochi in 2008, Sarychev in 2009, and Nabro in 2011. This is the time period covered by all three of the satellite products used in this work. Smaller eruptions during this time period (e.g. Cordon Caulle, Grimsvötn, Redoubt) were not included due to the difficulty of detecting a clear decay of SO₂ in the MLS data set.

We first compare the results between Michelson Interferometer for Passive Atmospheric Sounding (MIPAS) and the Microwave Limb Sounder (MLS). Both limb-sounding instruments, the SO₂ retrievals from these products allow for a vertically-

resolved analysis of the e -folding time. We report decay timescales in three different height bins (the same ones used by Höpfner et al. (2015)): 10 to 14 km, 14 to 18 km, and 18 to 22 km. In general, we find that uncertainty in the decay timescale is much larger in the MLS data set than in MIPAS. This is primarily a consequence of apparent interferences in the background seasonal cycle in the MLS data. While this seasonal cycle has been noted in previous work (Pumphrey et al., 2015) and is likely due to HNO_3 and O_3 , it is not obvious what the form of the seasonal cycle should be, and this makes it inherently challenging to accurately determine the shape and magnitude of the volcanic perturbation. Furthermore, the MLS data is much noisier than the MIPAS data and features large negative values in the SO_2 mixing ratio. We suggest that the noise and negative bias is a consequence of pressure broadening; microwave emissions are more subject to pressure broadening, which obscures the signal received by the MLS instrument. This notion is further supported by the fact that the noise and negative bias is far less significant in the 18 to 22 km height bin (Fig. 2); the impacts of pressure broadening decrease with altitude (Pierrehumbert, 2010). Comparisons of the vertically-resolved decay timescales between satellite observations and a global climate chemistry model (WACCM, Gettelman et al. (2019)) indicate that the model generally predicts a faster decay timescale than the observations show, particularly at higher altitudes (Fig. 4). The 5th to 95th percentile range of decay timescales in the model also tends to be narrower than the observations. The reasons for these discrepancies requires future investigation.

We also compare the decay timescales of SO_2 within the whole stratospheric column. Here we include an additional observational data set from the Ozone Monitoring Instrument (OMI), which is a common choice for analyzing volcanic SO_2 decay (e.g., Carn et al., 2022; Zhu et al., 2020; Krotkov et al., 2010). We find that the timescale in the OMI data set is consistently the fastest across the three eruptions analyzed. The uncertainty range of the OMI data only minimally overlaps with uncertainty range of any of the other three products for the Nabro eruption, suggesting that OMI might overestimate the rate of stratospheric SO_2 decay following an eruption. This is a bias and should be considered when analyzing volcanic SO_2 with OMI and other nadir-sounding instruments.

The range of decay timescales also limits the ability to accurately determine the initial mass loading following an eruption when fitting applying an exponential decay to the SO_2 data. Both Pumphrey et al. (2015) and Höpfner et al. (2015) utilize this method to evaluate the total SO_2 in MLS and MIPAS, respectively. However, the significant variations in decay timescale reported in this work translates to similar uncertainty in the total mass of SO_2 emitted by the volcano. This is a key quantity for understanding the climate and chemical impacts of volcanic eruptions, and this work suggests that constraining it using a exponential fit potentially comes with significant uncertainties.

The high variability in decay timescales across observational products and the lack of consensus with the WACCM model makes it difficult to assess whether differences in decay timescale from one eruption to the next are due to different oxidation processes or just the result of dynamics and the inherent difficulty of constraining and observing volcanic plumes. Zhu et al. (2020) argued that the relatively short decay timescale of approximately 7 days was indicative of heterogeneous oxidation on ash being an important process after the Kelut eruption in 2014. Kelut, like Nabro, was a tropical eruption but was known to inject large amounts of ash into the atmosphere that persisted for longer than usual (Vernier et al., 2016). The observations of Nabro in the 14 to 18 km height bin suggest longer SO_2 decay timescales ranging from about 10 to over 60 days, indicating that the ash effect, if indeed significant, may well be specific to certain eruptions. Moreover, Zhu et al. (2020) use OMI data

in their analysis, and as shown here, OMI results in fast decay timescales compared to MLS or MIPAS. Note that we don't present analysis of Kelut in this paper, as the MLS data for that eruption lacked a strong signal (not shown), and the MIPAS data ended in 2012, prior to the eruption of Kelut.

490 The eruption of Hunga in 2022 has also been noted for its remarkably fast SO₂ *e*-folding time (Asher et al., 2023; Zhu et al., 2022). A submarine volcano, Hunga injected an estimated 150 Tg water vapor (H₂O) and 0.41 ± 0.01 Tg SO₂ into the stratosphere, and the rapid decay of SO₂ has been attributed to a significant increase in OH following the H₂O injection (Asher et al., 2023). The plumes from the eruptions also reached over 30 km above the surface (Asher et al., 2023). Given the unusual nature of the eruption, we don't include a quantitative analysis of it here. Rather, we mention it as a further example of the
495 possible variability in the conditions influencing volcanic SO₂ oxidation.

Our work suggests that the current SO₂ data reported by available observational products are subject to significant uncertainty when examining the stratospheric decay of volcanic SO₂. The varying strengths and shortcomings of the different observational products should be accounted for when using them to determine chemical mechanisms and SO₂ mass loading. Furthermore, the forthcoming loss of MLS (the only limb-sounding SO₂ instrument in operation) will leave a significant gap
500 in our ability to monitor the stratosphere.

Code and data availability. All satellite data used in this study are publicly available. MIPAS (with registration): <https://www.imk-asf.kit.edu/english/308.php>. MLS: https://disc.gsfc.nasa.gov/datasets/ML2SO2_005/summary?keywords=so2. OMI: https://disc.gsfc.nasa.gov/datasets/OMSO2_003/summary. CESM2-WACCM6 data, along with scripts for analysis and generating figures are provided upon request.

Appendix A: Additional MLS and MIPAS Comparisons

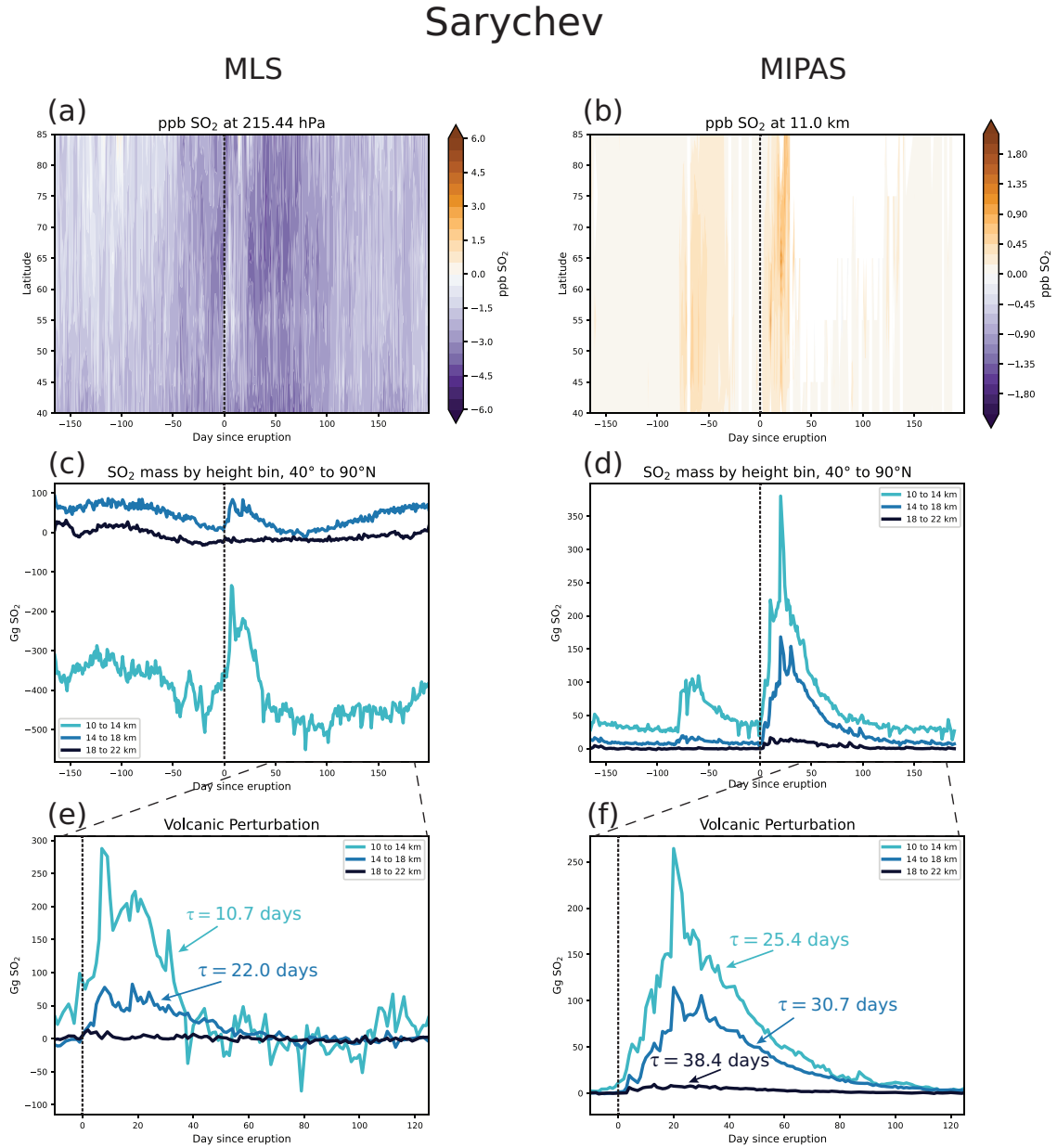


Figure A1. Comparison of MLS and MIPAS observations during 2009 and the Sarychev eruption, using the same format as Fig. 2. Note that the smaller signal seen in the MIPAS data prior the the Sarychev eruption is due to the eruption of Redoubt in March, 2009 (Carn, 2024).

Nabro

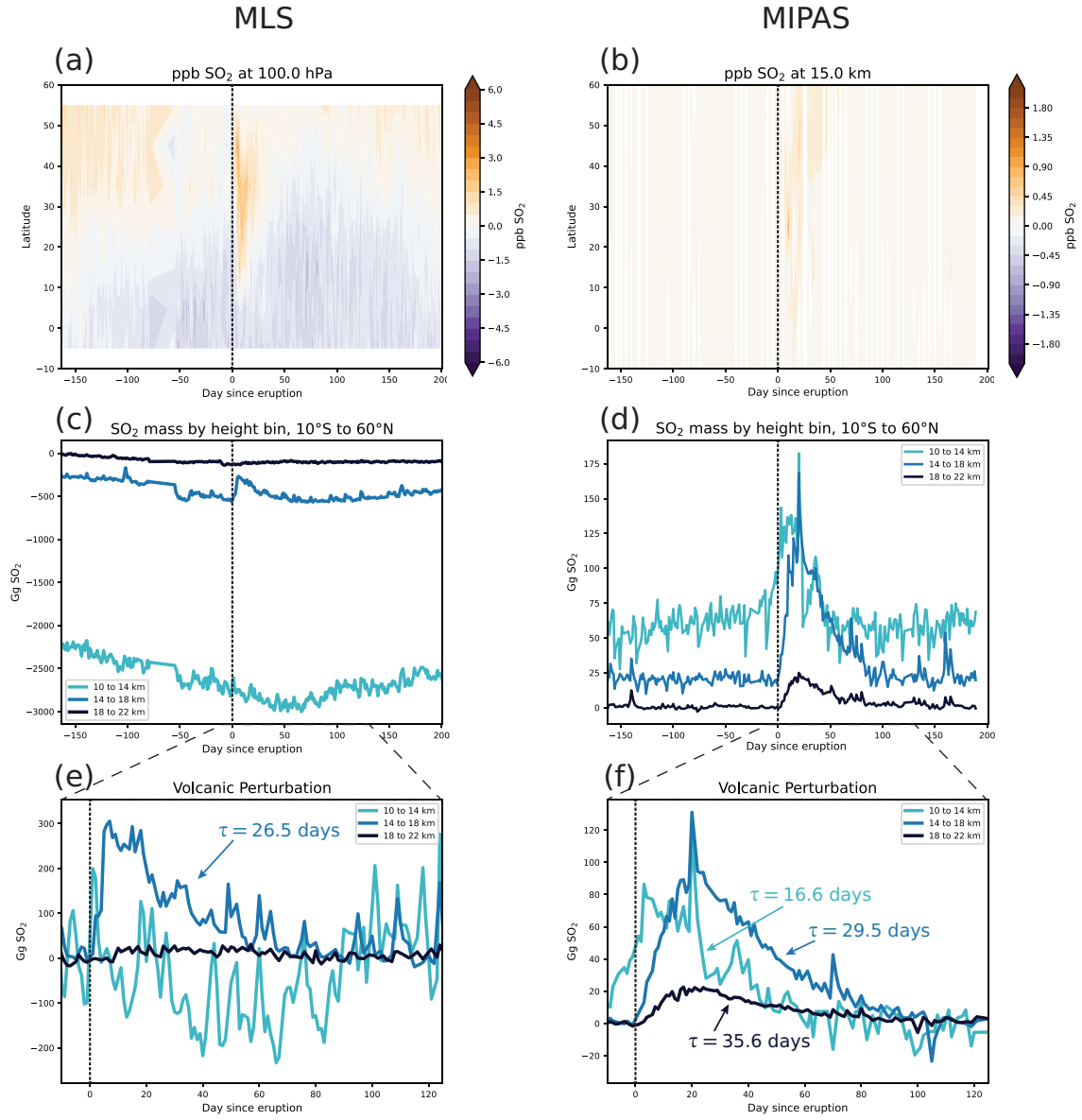
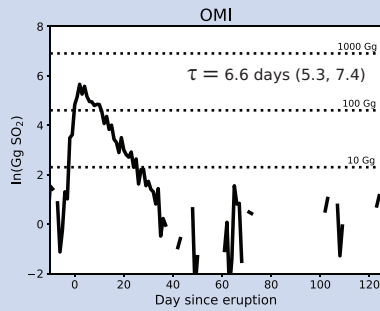
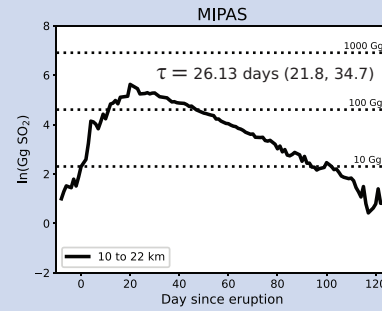
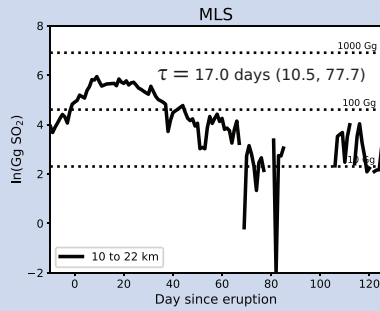


Figure A2. Comparison of MLS and MIPAS observations during 2011 and the Nabro eruption, using the same format as Fig. 2.

505 Appendix B: Comparison with OMI

Sarychev

Observations



Model

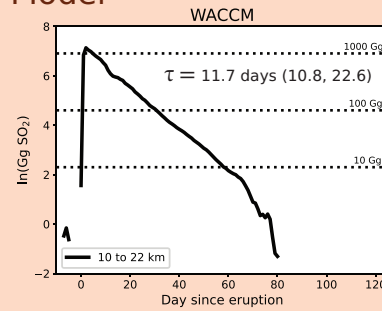
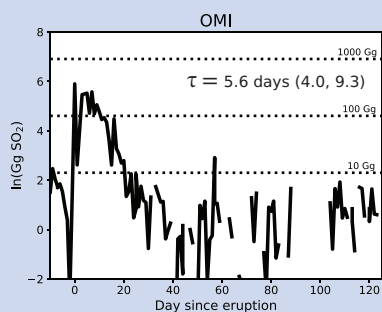
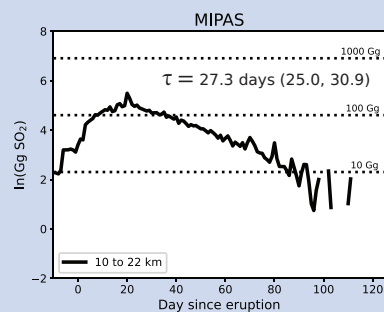
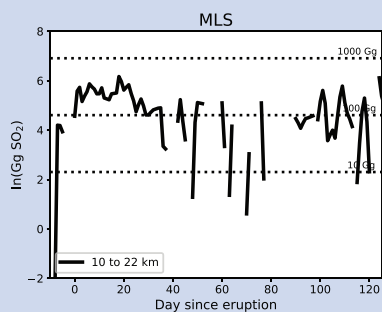


Figure B1. Comparison of stratospheric e -folding times for the 2009 Sarychev eruption, using the same format as Fig. 5.

Nabro

Observations



Model

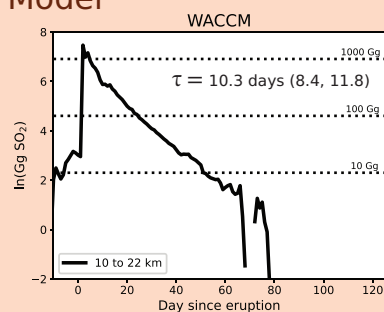


Figure B2. Comparison of stratospheric e -folding times for the 2011 Nabro eruption using the same format as Fig. 5. Note that there was not a sufficient signal in the MLS data to report an e -folding time.

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Competing interests. The authors declare that they have no conflict of interest.

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