Atmos. Chem. Phys., 25, 3541–3565, 2025 https://doi.org/10.5194/acp-25-3541-2025 © Author(s) 2025. This work is distributed under the Creative Commons Attribution 4.0 License.





On the estimation of stratospheric age of air from correlations of multiple trace gases

Florian Voet¹, Felix Ploeger^{1,2}, Johannes Laube², Peter Preusse², Paul Konopka², Jens-Uwe Grooß², Jörn Ungermann², Björn-Martin Sinnhuber³, Michael Höpfner³, Bernd Funke⁴, Gerald Wetzel³, Sören Johansson³, Gabriele Stiller³, Eric Ray^{5,6}, and Michaela I. Hegglin^{1,2,7}

¹Institute for Atmospheric and Environmental Research, University of Wuppertal, Wuppertal, Germany ²Institute of Climate and Energy Systems: Stratosphere (ICE-4), Forschungszentrum Jülich, Jülich, Germany ³Institute of Meteorology and Climate Research - Atmospheric Trace Gases and Remote Sensing (IMK-ASF), Karlsruhe Institute of Technology, Karlsruhe, Germany

 ⁴Institute of Technology, Karlstune, Germany
 ⁴Instituto de Astrofísica de Andalucía, CSIC, Granada, Spain
 ⁵NOAA Chemical Sciences Laboratory, Boulder, CO, USA
 ⁶Cooperative Institute for Research in Environmental Science, University of Colorado Boulder, Boulder, CO, USA
 ⁷Department of Meteorology, University of Reading, Reading, UK

Correspondence: Florian Voet (fvoet@uni-wuppertal.de)

Received: 20 August 2024 – Discussion started: 5 September 2024 Revised: 23 December 2024 – Accepted: 6 January 2025 – Published: 25 March 2025

Abstract. The stratospheric circulation is an important element in the climate system, but observational constraints are prone to significant uncertainties due to the low circulation velocities and uncertainties in available trace gas measurements. Here, we propose a method to calculate mean age of air as a measure of the circulation from observations of multiple trace gas species which are reliably measurable by satellite instruments, like trichlorofluoromethane (CFC-11), dichlorodifluoromethane (CFC-12), chlorodifluoromethane (HCFC-22), methane (CH₄), nitrous oxide (N₂O), and sulfur hexafluoride (SF₆), and we show that this method works well in most of the lower stratosphere up to a height of about 25 km. The method is based on the compact correlations of these gases with mean age. Methodological uncertainties include effects of atmospheric variability, non-compactness of the correlation, and measurement related effects inherent for satellite instruments. The multi-species age calculation method is evaluated in a model environment and compared against the actual model age from an idealized clock tracer. We show that combination of the six chosen species reduces the resulting uncertainty of derived mean age to below 0.3 years throughout most regions in the lower stratosphere. Even small-scale, seasonal features in the global age distribution can be reliably diagnosed. The new correlation method is further applied to trace gas measurements with the balloon-borne Gimballed Limb Observer for Radiance Imaging of the Atmosphere (GLORIA-B) instrument. The corresponding deduced mean age profiles agree reliably with SF₆-based mean age below about 22 km and show significantly lower uncertainty ranges. Comparison between observation-based and model-simulated mean ages indicates a slow-biased circulation in the ERA5 reanalysis. Overall, the proposed mean age calculation method shows promise to substantially reduce the uncertainty in mean age estimates from satellite trace gas observations.

1 Introduction

The stratospheric meridional overturning circulation, termed Brewer–Dobson circulation (BDC; see Holton et al., 1995; Butchart, 2014), is an important element in the climate system as it controls the distributions and variability of longlived trace gas species in the stratosphere and troposphere. Changes in such radiatively active species, in turn, may substantially affect the global radiation budget and atmospheric chemistry. Hence, profound knowledge on BDC changes and the dynamical mechanisms involved is crucial for understanding past and future climate variations.

As BDC velocities are approximately 3 orders of magnitude slower than typical horizontal winds and cannot be directly measured, they must be inferred from the stratospheric distributions of long-lived trace gas species (Butchart, 2014), such as SF₆, CH₄, N₂O, or different chlorofluorocarbons (CFCs). But the relations between changes in these chemical species and changes in the BDC are complex and not fully understood. In particular, changes in observed trace gas mixing ratios do not indicate a long-term acceleration of the BDC, as predicted by global climate models in response to increasing greenhouse gas concentrations (e.g., Waugh, 2009; Engel et al., 2009). Furthermore, stratospheric reanalysis datasets, which are designed to provide a best guess of the atmospheric state, show very different changes in the BDC over the past few decades (e.g., Chabrillat et al., 2018; Laube et al., 2020; Ploeger et al., 2019, 2021). Hence, there is a need for improvement in the representation of the BDC in models and reanalyses, by use of better observational constraints, and for enhancing process understanding on the effects of the BDC on the global distributions of long-lived trace gases.

Mean age of air (AoA) is a commonly used diagnostic to determine the strength of the BDC from trace gas mixing ratios (Waugh and Hall, 2002). As first described by Hall and Plumb (1994), mean age can be deduced from mixing ratios of a so-called "clock tracer", a trace gas species which is linearly increasing in the troposphere and is free of sources or sinks in the stratosphere above. In models, such idealized tracers can be easily defined, and AoA can be calculated exactly. In the real atmosphere, stratospheric AoA can be derived from observations of trace gas species that approximate ideal clock tracers. Two trace gases that represent suitable approximations of ideal clock tracers are SF₆ and, to a lesser extent, carbon dioxide (CO₂). Since air enters the stratosphere mainly through the tropical tropopause region, the mixing ratio time series of an ideal clock tracer at some point in the stratosphere can be approximated by shifting its tropical tropospheric time series by a specific time. This lag time can be interpreted as the mean age of air at the point of observation in the stratosphere. The lag time can be determined by identifying that point in time at which the tropospheric record matched the observed mixing ratio (Hall and Plumb, 1994). This leads to a strong negative correlation between the mixing ratios of approximate clock tracer and AoA in the stratosphere, because higher mixing ratios can be found later and lower ones earlier in the tropospheric record. The lag time method is mentioned here because it illustrates the concept of AoA and explains the occurrences of tight correlations between approximate clock tracers and AoA, which build the foundation of this study. However, as SF₆ and CO₂ deviate from ideal clock tracers in certain specific ways (see below), more sophisticated methods that take at least some of these deviations into account are usually employed instead of a simple lag time. CO₂ possesses a strong seasonal cycle in tropospheric mixing ratios superimposing the long-term increase and an additional stratospheric source related to methane oxidation. SF₆ mixing ratios in the stratosphere are influenced by downward transport of SF₆-depleted air from the mesosphere. The tropospheric evolution of both SF₆ and CO₂ deviates from perfect ideal clock-tracer linearity.

In addition to these deviations from the behavior of an exact clock tracer, the retrieval of SF₆ and CO₂ mixing ratios from observations of remote sensing instruments on satellites or balloons is challenging and comes with significant uncertainties for single profiles (Stiller et al., 2008, 2012; Haenel et al., 2015; Saunders et al., 2024). AoA derived with standard methods from satellite observations of SF₆ and CO₂ is therefore also subject to high uncertainty, limiting the accuracy of the standard methods to calculate mean age of air for satellite measurements (Waugh and Hall, 2002). In the case of satellite measurements of SF₆, for instance, AoA calculations can be realized for zonally averaged data, because the density of measurements along the orbit path is usually dense enough to provide enough observations in a latitude band for reducing the measurement uncertainty sufficiently (Stiller et al., 2012).

Figure 1 illustrates this problem using the mean SF₆ profile from the remote sensing measurements during a recent balloon flight (see Methods section and Sect. 3.4). The SF_6 measurement uncertainty translates into an age uncertainty of several years. This age uncertainty is so large that it spans the range between the measured and simulated age profiles, although these mean profiles differ by around 1 year. Hence, the mean age calculated from SF₆ remote sensing measurements is insufficient for constraining the stratospheric circulation on a small scale. Therefore, including other trace gas species with lower measurement uncertainty in the mean age calculation appears particularly appealing to decrease the inherent uncertainty (Ray et al., 2014; Engel et al., 2017). Especially for deducing mean age along single measurement profiles, without including additional averaging, such improvements of the methodology to calculate mean age are needed.

Leedham Elvidge et al. (2018) have shown that the trace gases CF_4 , C_2F_6 , C_3F_8 , CHF_3 , HFC-125a, and HFC-227ea also constitute approximations of ideal clock tracers and can be used to derive stratospheric AoA with standard methods. However, the aforementioned six trace gases are similarly



Figure 1. Mean-AoA–height profile along measurement locations during the balloon launches of GLORIA-B from Kiruna, Sweden, in late August 2021. Blue line: mean-AoA–height profile calculated with the standard method (Garny et al., 2024b) and sink correction (Garny et al., 2024a) from SF₆ observations of GLORIA-B. Blue shading: uncertainty range of blue line. Dotted black line: actual AoA of the CLaMS model from the clock tracer calculated from the mean values of the ideal model clock tracer along the points of observation by GLORIA-B. Black shading: 1 standard deviation around the respective mean values that constitute dotted black lines.

difficult to retrieve from remote sensing measurements like SF_6 and CO_2 , and we here focus on other species which can be reliably measured with typical satellite instruments. As a priori values of CO_2 are commonly used for the calibration of remote sensing instruments and as CO_2 is not commonly retrieved at all, CO_2 is also not included in this study. In the case of in situ measurements, Ray et al. (2024) recently proposed a different method to increase the accuracy of AoA by deriving it from SF_6 and CO_2 simultaneously, although requiring additional assumptions (e.g., shape of age spectrum).

Even trace gases that approximate ideal clock tracers to a lesser extent than those previously mentioned can show at least partially tight correlations with AoA in the stratosphere, making them potentially useful for determination of AoA from remote sensing measurements if they can be retrieved with sufficiently low uncertainty (Schoeberl et al., 2005). Even though standard methods to calculate AoA cannot be applied for such trace gases, they can still be used for the calculation of AoA if their correlations with AoA are known (e.g., Hegglin et al., 2014).

This study presents a new method to derive AoA from atmospheric measurements of multiple long-lived trace gases. The method is based on the correlations of the trace gas species CCl_3F (CFC-11), CCl_2F_2 (CFC-12), CHCIF₂ (HCFC-22), CH₄, N₂O, and SF₆ with AoA. The application and evaluation of the method are carried out using simulations with the chemistry transport model CLaMS (Chemical Lagrangian Model of the Stratosphere). Notably, a recent study by Dube et al. (2025) also utilizes the tight correlations between long-lived trace gases and AoA in the CLaMS model. However, their focus is on deriving decadal trends in AoA from these correlations rather than AoA itself. Additionally, Linz et al. (2017) used N₂O in addition to SF₆ to calculate AoA. They derived AoA from N₂O using an empirical relationship between AoA and N₂O that was calculated from balloon and aircraft measurements. Their study leveraged AoA to calculate the strength of the total overturning circulation through different isentropes, offering insights into large-scale atmospheric dynamics.

In this study, however, a weighted-mean AoA is calculated from modeled satellite measurements of the six aforementioned trace gases. The difference between this weightedmean AoA and the actual AoA from the clock tracer in the model is found to remain below half a year in the lower stratosphere. In addition, the proposed method is also applied to measurements with the GLORIA-B instrument, yielding more plausible results and drastically reduced uncertainty compared to conventional methods. The present study can be seen as a proof of concept, demonstrating how accurately AoA can be calculated from satellite measurements of multiple trace gases and their correlations with AoA. The ESA Earth Explorer 11 candidate Changing-Atmosphere Infra-Red Tomography Explorer (CAIRT) was the primary motivation for the proposed method, but the method is generally applicable to a wider range of data.

The setup of the CLaMS simulation and the proposed method to derive AoA from the correlations of the six trace gases with AoA are described in detail in Sect. 2.1 and 2.2, respectively. Section 2.3 describes the GLORIA-B instrument, measurements conducted with GLORIA-B used in this study, and the way AoA was derived for these measurements and compared to CLaMS results. The results of this study are presented in Sect. 3. Here, the new age calculation method is first applied to model data for a self-consistent proof of concept and thereafter applied to balloon-borne remote sensing measurements. The results are further discussed in more detail in Sect. 4, and conclusions drawn from this discussion are presented in Sect. 5.

2 Methods

2.1 Setup of the Chemical Lagrangian Model of the Stratosphere (CLaMS)

CLaMS is an offline Lagrangian chemical transport model, usually driven by wind data from a meteorological reanalysis (McKenna et al., 2002b, a). The Lagrangian formulation of transport sets CLaMS apart from most other chemical transport models that operate in an Eulerian framework. As such, CLaMS evaluates the mixing ratios of trace gas species along air parcel trajectories rather than on a fixed spatial grid. The number and distribution of these air parcels change with every time step, forming an adaptive irregular model grid.
 Table 1. Trace gases implemented in CLaMS that are used to derive

 AoA. Lower boundary values of tracers were defined with ground-based in situ measurements.

Trace gas	Datasets used to create lower boundary
Sulfur hexafluoride (SF ₆)	Dutton et al. (2023)
Trichlorofluoromethane (CCl ₃ F) (CFC-11 for short)	Dutton et al. (2022b)
Dichlorodifluoromethane (CCl_2F_2) (CFC-12 for short)	Dutton et al. (2022c)
Chlorodifluoromethane (CHClF ₂) (HCFC-22 for short)	Montzka et al. (2015)
Methane (CH ₄)	Lan et al. (2023)
Nitrous oxide (N ₂ O)	Dutton et al. (2022a)

The transport in the CLaMS model is based on a hybrid vertical coordinate, ζ , which changes from an orography-following coordinate in the lower troposphere to an isentropic, potential temperature coordinate above the tropopause region and throughout the stratosphere. The model atmosphere is divided by ζ into 45 different layers. ζ is equal to the potential temperature θ above a predefined level and gradually returns to zero at the surface. Independent of the elevation of the surface, ζ is defined in a way that it is equal to zero at every surface point (for details, see Pommrich et al., 2014). The lowest model layer, representing the lower boundary layer of the model, extends from the surface to approximately 1.5 km (specifically, $0 \text{ K} < \zeta < 70 \text{ K}$), which roughly corresponds to the height of the planetary boundary layer. The uppermost model layer (upper boundary layer) covers the potential temperature range 2350-2650 K (altitude of about 55 km); hence, the model domain extends from the surface to about the stratopause. The emissions of a trace gas over the course of the simulation are specified through its lower boundary condition as mixing ratios. In this study, the lower boundary condition of each trace gas is defined by a set of observation-based time series of zonal mean surface mixing ratios at different latitudes over the simulation period. The values of these time series are interpolated latitude-wise onto the Lagrangian air parcels inside the lower boundary layer at the beginning of each new simulation time step. The air parcels in the upper boundary layer are treated in the same way, with an upper boundary condition on trace gas mixing ratios prescribed in the uppermost model layer. The influence of the upper boundary condition strongly depends on the properties of the given trace gas species in question.

Six suitable trace gas species with long stratospheric lifetimes with sources exclusively in the troposphere were selected for this study. These species are listed in Table 1. The tropospheric sources of these trace gases are represented by the lower boundary conditions, since none of them are products of chemical reactions in the atmosphere to any significant amount. The observation datasets used to create the lower boundary condition of each trace gas are referenced in Table 1. The atmospheric losses of N₂O, CH₄, CFC-11, and CFC-12 are taken into account as described by Pommrich et al. (2014). For the use in the present study, the additional trace gas species SF₆ and HCFC-22 have been implemented in the CLaMS model similarly to the method described by Pommrich et al. (2014). The depletion mechanisms for HCFC-22 implemented in CLaMS are represented by the following reactions:

$CHClF_2 + O($	$^{1}D) \rightarrow 1$	products.	($(\mathbf{R}1)$)
$C \Pi C \Pi \gamma + O ($	$D \rightarrow $	products,	,		

 $CHClF_2 + OH \rightarrow products,$ (R2)

 $CHClF_2 + h\nu \rightarrow products,$ (R3)

for wavelengths $\lambda = \frac{c}{\nu} \le 220$ nm. The photolysis rates for the last reaction are calculated with the CLaMS photolysis code (Becker et al., 2000; Burkholder et al., 2019). Together, these three loss reactions form a significant sink in the stratosphere.

SF₆ is the only trace gas in the list that does not have any significant chemical or photolytic loss reaction throughout the troposphere and stratosphere (the model domain considered here). SF_6 is mainly removed from the atmosphere through photolysis and electron attachment in the mesosphere, which is not included in the model. Therefore, SF_6 is treated simply as an inert tracer. However, depleted SF₆ mixing ratios transported downward from the mesosphere to the stratosphere are accounted for by the specification of a realistic upper boundary condition, which is based on measurements from the Michelson Interferometer for Passive Atmospheric Sounding (MIPAS) instrument that operated on the ESA Environmental Satellite (Envisat) from 2002 till 2012 (Fischer et al., 2008). Specifically, the spectra version V5H with the baseline version 21 and the spectra version V5R with the baseline versions 224 and 225 were used (Kiefer, 2021). From these measurements, monthly zonal mean time series of SF₆ mixing ratios over the course of the measurement period were created at different latitudes for the potential temperature level of 2500 K. The time series for higher latitudes show strong seasonal cycles caused by the downward transport of SF₆-depleted air from the mesosphere and the seasonality of the BDC itself. This set of time series is used as the upper boundary for SF₆ when the simulation time is within the time period of the measurements. The upper boundary condition for times outside of the measurement period was created by parameterizing the depicted seasonal cycle of each latitude with a sinusoidal least-squares fit of a single frequency and adding it to a shifted tropospheric tropical time series (taken from the lower boundary of SF_6). The time shifts correspond to the zonal mean AoA values at the respective latitude at the 2500 K potential temperature level. These mean AoA values were derived consistently from MI-

PAS measurements of SF₆ (Stiller, 2021). This simple parameterization could be further improved by including other modes of variability (e.g., semi-annual oscillation; Garcia et al., 1997), which could be important for analysis of interannual variability, which is, however, not considered in this study. Similar to Pommrich et al. (2014), the climatology of the Halogen Occultation Experiment (HALOE; Grooß and Russell, 2005) was used as the upper boundary for CH₄ in this study. More specifically, the mean seasonal cycle from the HALOE climatology was used for every year of the simulation period. The Mainz photochemical 2-D model (Grooß, 1996) was used for the upper boundary of N_2O , CFC-11, and CFC-12, which are decomposed completely well below about 2500K and do not reach the upper boundary layer to any significant amount. Therefore, their upper boundaries were kept at zero throughout the entire simulation period. HCFC-22 does reach the upper boundary layer but, in relation to its tropospheric value, in much smaller quantities than SF₆. Mesospheric loss processes for HCFC-22 can therefore be neglected compared to the stratospheric ones (Reactions R1 to R3). An open upper boundary condition (null flux) has therefore been defined for HCFC-22.

In addition to the six actual trace gases, a completely passive tracer without any atmospheric sources or sinks and with linearly increasing lower boundary values was included in the model, as well. It will be called the clock tracer in the following and will be used to calculate the actual mean age of air in the model using the standard lag time method described by Hall and Plumb (1994). The simulation was driven by meteorological data from the European Centre for Medium-Range Weather Forecasts Reanalysis v5 (ERA5) and covered the period from 1 January 1979 to 31 December 2022. The vertical cross-isentropic model transport in CLaMS was calculated from the ERA5 total diabatic heating rates (see Ploeger et al., 2021). For the initial conditions of the simulated atmosphere, approximately 1.4 million air parcels were spread out by employing the principle of distributing air parcels based on entropy and static stability, as outlined by Konopka et al. (2012) and Pommrich et al. (2014). The mixing ratios of the six trace gases inside the initial air parcels were set to zero at the first time, i.e., 1 January 1979. Thereafter, a 20-year-long spinup simulation was carried out with repeating lower and upper boundary conditions and meteorology from the first simulation year of 1979. This spinup guarantees that the initial mixing ratio distributions of CFC-11, CFC-12, and the clock tracer on the first day of the transient simulation on 1 January 1979 represent the actual atmospheric conditions reasonably well. The initial mixing ratio distributions of SF₆, CH₄, N₂O, and HCFC-22 were estimated in a different way. The mixing ratios of these four trace gases in every air parcel on 1 January 1979 were all taken from mean tropical time series that were created from the respective lower boundary conditions. The points in time at which the mixing ratios were taken correspond to estimations of the points in time at which each air parcel was in contact with the surface for the last time before being transported to its final position on 1 January 1979. The estimations are based on annually averaged AoA values derived from observations of SF_6 by MIPAS (Stiller, 2021).

Simulation output for the year 2011, which is near the end of the operational period of MIPAS, was chosen for the analysis of the modeled satellite measurements. At the end of the operational period of MIPAS, the measurement-based upper boundary values of SF_6 had the maximal amount of time to spread below the upper boundary in the model atmosphere. The model output of SF₆, which is of particular importance for the aforementioned analysis, is therefore most representative of the real SF₆ distribution in the atmosphere for the year 2011. For application of the proposed method to the GLORIA-B measurements, the CLaMS model output for the days of the two balloon launches was used. The version of CLaMS used in this study is similar to the one described by Konopka et al. (2022), with the CAPE (convective available potential energy) triggering the unresolved convection in the model instead of the moist Brunt-Vaisala frequency. Both parameters as well as the convection parameterization are described in Konopka et al. (2019).

2.2 Age of air calculation

The six trace gases were selected on the basis of their long stratospheric lifetimes (see Table 2), for which strong correlations between mixing ratio and AoA can be expected in the stratosphere. These correlations were visualized by taking the model output for individual days and plotting the mixing ratios of each trace gas against the actual AoA values obtained from the model clock tracer (for a schematic, see Fig. 2; for an application to real data, see Fig. 3). In order to investigate the influence of seasonality in stratospheric transport, 1 d from each of the four seasons was selected. Note that the calculation was performed on the original Lagrangian model output (irregular grid) to avoid smoothing due to interpolation. To ensure compact correlations for all considered species, an upper limit for applicability of the method of 25 km was established (see Sect. 3). As the dependencies of the mixing ratios with respect to AoA are slightly different for the two hemispheres due to the asymmetry of the BDC (e.g., Konopka et al., 2015), the two hemispheres are considered separately in the following calculations.

Figure 2 illustrates how the model results are used to identify a given tracer mixing ratio with a corresponding AoA value and how the uncertainty range of that AoA value is estimated. The small black dots represent a scatterplot of the modeled mixing ratio against the actual model AoA at all grid points below 25 km in the same hemisphere and on the same day for any of the six tracers. The entire range of mixing ratios covered by the trace gas at all grid points is divided into 150 bins of the same width, with bin number 1 being the lowest and bin number 150 being the highest in terms of mixing ratio. For visual clarity, only the last



Figure 2. Schematic representation of method used to estimate the AoA corresponding to measured volume mixing ratios (vmr's) and its associated uncertainty (see the main text for details).

three of these mixing ratio bins are shown in the figure. The histogram illustrates the distribution of AoA within a given mixing ratio bin. The blue area in the histogram highlights the 1σ range around the mean AoA value of the distribution (mean value ± 1 standard deviation). Similarly, the blue area in each of the three depicted mixing ratio bins corresponds to the 1σ range around the mean value of the respective AoA distribution inside. Such 1σ ranges are calculated for each one of the 150 mixing ratio bins. Subsequently, a midpoint for each bin with the sample mean AoA as the x coordinate and the middle of the bin range as the y coordinate was then defined. This constructed set of midpoints constitutes a sort of lookup table that can be used to interpolate an AoA value for any given mixing ratio within the range covered by the bins. Since the binning and averaging of the model data create some unwanted noise, the series of midpoints is smoothed with a polynomial fit through a Savitzky-Golay filter before it is used as a lookup table in the described way. The Savitzky-Golay filter (scipy.signal.savgol_filter) was implemented using the SciPy library (Virtanen et al., 2020). The green line in Fig. 2 represents such a polynomial fit, i.e., the final lookup table. Since the number of points near the edges of the range can sometimes be too sparse to guarantee a sufficient statistic, the first and last couple of bins are ignored during the described procedure if any of them contained fewer than 50 points.

Depending on the trace gas and the day of the year, the correlation between tracer mixing ratio and AoA can eventually break down as mixing ratios decrease. This means that the gradient of the polynomial fits (lookup tables) can become extremely steep, resulting in essentially no variation in AoA for a varying mixing ratio (see Fig. 4). Lower mixing ratios, where the gradient becomes too steep, no longer carry information about AoA and are therefore no longer useful for its calculation. We consider the correlation of a trace gas with AoA to be at risk of breaking down if the gradient of the respective lookup table exceeds 5 times the average gradient in the AoA range between 1 and 4 years. If this condition is met in five out of nine consecutive mixing ratio bins, the correlation is considered to have broken down, and the series of bins in question, as well as all subsequent bins, are removed from the lookup table. This ensures that short intervals of steeper gradients are still included in the lookup tables.

The uncertainty of AoA obtained from interpolating the lookup table at a measured mixing ratio is based on the spread of the clock-tracer AoA around the mixing ratio (model variability) and the uncertainty of the mixing ratio itself that stems from its measurement. For the model variability, the aforementioned standard deviation of the AoA distribution in the respective mixing ratio bin is used. For the measurement uncertainties of the six trace gases, the values listed in Table 2 are used. These values represent estimations of the total uncertainties for the measurement of the six trace gases with the proposed CAIRT instrument. These values are representative of a typical satellite instrument and take into account both the detector noise and biases, e.g., from in-flight calibrations (ESA, 2023). It is expected that this is a reasonable reflection of the true uncertainty as long as the AoA inferred from several trace species are combined, and the uncertainty would be combined but likely is an underestimate where only one or two trace species remain to have meaningful correlations. The conversion of the mixing ratio measurement uncertainty to the uncertainty of the obtained AoA is done through error propagation by calculating the tangent to the polynomial fit at the measured mixing ratio (see Fig. 2). The model variability and the converted measurement uncertainty added together as a root-mean-square error (RMSE) yield the total uncertainty of the AoA obtained for the measured mixing ratio. Instead of doing the described calculation of the total uncertainty each time an AoA value is interpolated from the lookup table, the uncertainty calculation is done in advance for every point of the lookup table, and the series of resulting uncertainties is subsequently added to the table. This way, both AoA and its uncertainty can be interpolated from the lookup table for a given mixing ratio.

The method described above can be used to derive an AoA_i with a respective uncertainty σ_i for each one of the six trace gases *i* if all of them are measured simultaneously. In this case, the uncertainty-weighted-mean AoA,

$$\overline{\text{AoA}} = \frac{\sum_{i} \left(\sigma_{i}^{-2} \text{AoA}_{i}\right)}{\sum_{i} \sigma_{i}^{-2}},$$
(1)

and the uncertainty thereof,

$$\overline{\sigma} = \sqrt{\frac{1}{\sum_{i} \sigma_i^{-2}}},\tag{2}$$

can be calculated. The weighted-mean uncertainty $\overline{\sigma}$ is significantly lower than each one of the individual uncertainties σ_i .

Trace gas	Expected measurement error ^a	Total atmospheric lifetime (years) ^b	Stratospheric lifetime (years) ^c
SF ₆	0.2 ppt	850-1280	_
CFC-11	20 ppt	52	55
CFC-12	20 ppt	102	103
HCFC-22	6 ppt	11.6	120
CH ₄	0.04 ppm	11.8	123 ^d
N ₂ O	1 ppb (< 20 km) 4 ppb (> 20 km)	109	195 ^d

Table 2. Expected measurement error and atmospheric (stratospheric) lifetime for each trace gas.

^a Based on the analysis described in Chap. 4.3.5 of the European Space Agency report of assessment (ESA, 2023)

"Total Lifetime" in Table A-5 in the annex of WMO (2022).

^c "Stratospheric Lifetime 2022" in Table A-5 in the annex of WMO (2022).

^d Brown et al. (2013).

2.3 GLORIA-B instrument and data analysis

GLORIA-B is a cryogenic limb-imaging Fourier transform spectrometer. This instrument operates in the thermal infrared spectral region between wavelengths of about 7 and 13 μ m (wavenumbers between about 750 and 1400 cm⁻¹) using a two-dimensional detector array (Friedl-Vallon et al., 2014; Riese et al., 2014). The high spectral sampling of $0.0625 \,\mathrm{cm}^{-1}$ allows for the separation of individual spectral lines from continuum-like emissions such that many trace gases can be retrieved simultaneously from the measured spectra with high spatial resolution. Two flights with GLORIA-B have been carried out so far in the framework of the European Union research infrastructure HEMERA. The first one was performed over northern Scandinavia from Kiruna (67.9° N, 21.1° E) on 21 and 22 August 2021. Radiance spectra obtained during the float of the gondola (up to 36 km) were analyzed between 17:11 and 05:39 UTC of the following day. The second flight took place on 23 and 24 August 2022 over Timmins, Ontario, Canada (48.6° N, 81.4° W). Spectra were obtained at the beginning of the float of the gondola from 20:35 until 08:26 UTC of the next day. Unfortunately, a leak in the balloon envelope caused the gondola to sink from 36 km (at the beginning of the float) down to 22 km at the end of the observation period. Retrieval calculations of trace species were performed with a least-squares fitting algorithm using analytical derivative spectra calculated by the Karlsruhe Optimized and Precise Radiative transfer Algorithm (KOPRA; Stiller et al., 2002; Höpfner et al., 2002). For a more detailed description of the retrieval method, refer to Johansson et al. (2018). A Tikhonov-Phillips regularization constraining with respect to a first derivative a priori profile was adopted. The resulting vertical resolution is better than 2 km for all molecules used in this study, except SF₆ (better than 3 km) and CFC-

113 (better than 4 km). Cloud-affected spectra were filtered out by a cloud index according to Spang et al. (2004). The error estimation of the retrieved target gases includes random noise, temperature errors, calibration, pointing and field of view inaccuracies, errors of non-simultaneously fitted interfering species, and spectroscopic data errors. All errors refer to the 1σ confidence limit.

The final product retrieved from the radiance spectra observed during a flight consists of a time series of mixingratio-height profiles for each of the six trace gases. Each profile in a time series contains the mixing ratio of the respective trace gas on 130 altitude levels in 0.25 km steps from the upper troposphere up to flight level. The altitude levels at which the trace gases are retrieved stay the same over the course of the flight. The latitudes and longitudes of the observation points change over time and along the altitude levels due to the movement of the gondola and the line of sight of the instrument. During both flights, the path of the gondola covered a relatively short distance of only approximately 300 km. The CLaMS model results have been interpolated onto the measurement locations of the two balloon flights for both the modeled mixing ratios of the six tracers and clocktracer mean age. The interpolation of the points and times of GLORIA-B measurements has been realized by trajectory mapping of the measurement locations at the closest synoptic time where model output is available and by subsequent spatial interpolation. Thereafter, the time series for both flights and both CLaMS and GLORIA-B were temporally averaged, creating mean mixing-ratio-height profiles for the six trace gases and the clock tracer. The new correlation-based mean age calculation method described in Sect. 2.2 was then applied to the mean profiles of the observed and modeled trace gases to create AoA-height profiles. Note that the required lookup tables were created from the CLaMS model output for the days of the balloon launches. In addition to that, the convolution method described by Garny et al. (2024b) in combination with the correction method described in Garny et al. (2024a) is used to derive AoA–height profiles from just SF₆. The actual AoA–height profiles for the model were created from the clock-tracer profiles as lag time (Hall and Plumb, 1994).

3 Results

3.1 Relations between trace gas mixing ratios and age of air

Figure 3 shows the relation between SF_6 and AoA from the results of the CLaMS model for the four selected days in 2011. Note that all panels of the figure show the results for both hemispheres together. For each day shown, the SF₆ mixing ratios are plotted against their corresponding AoA values from the clock tracer for all model points below 25 km. Additionally, the equivalent latitudes of the model points (Nash et al., 1996) are color-coded to visualize their dynamical characteristics. The SF₆ mixing ratios behave very similarly with respect to AoA at all four times up to ages of roughly 4.5 years. Overall, SF₆ mixing ratios decrease with increasing AoA, which is consistent with the almost linear increase in mixing ratios in the troposphere and the lack of sources and sinks in the stratosphere. There is a significant spread of mixing ratios in young air masses in the same hemisphere for ages below about 1.5 years, i.e., those air masses located in or near the troposphere. Air parcels from the Northern Hemisphere also have consistently higher mixing ratios than those from the Southern Hemisphere in this AoA range. This hemispheric difference can be explained by the meridional gradient of SF₆ mixing ratios in the troposphere, which is caused by the fact that SF₆ emissions occur predominantly in the Northern Hemisphere and that tropospheric SF₆ mixing ratios increase rapidly (Schuck et al., 2024a). From around 1.5 to 4.5 years, SF₆ and AoA correlate strongly, and their relation appears to be almost perfectly linear. Depending on the day, mixing ratios in either the Northern Hemisphere or the Southern Hemisphere start to spread out for AoA values above about 4.5 years. This collapse of the correlation is predominantly caused by the breakdown of the polar vortex at the end of winter in the respective hemisphere, which, in turn, induces downward transport of SF₆-depleted air masses from the mesosphere to the midlatitude stratosphere. Moreover, the spread in mixing ratios is stronger in the Southern Hemisphere as the polar vortex is more pronounced in the Antarctic than in the Arctic.

Figure A1 in Appendix A is similar to Fig. 3 but for CFC-12 instead of SF₆. Overall, the spread appears to be stronger and the general shape of the correlation is more convex for CFC-12 compared to SF₆. The higher compactness of the correlations for SF₆ can be explained by the presence of a stratospheric sink for CFC-12 in contrast to SF₆ and by the resulting much higher atmospheric lifetime of SF₆ compared to CFC-12 (see Table 2). In air masses in or near the troposphere, the spread is much smaller for CFC-12, because unlike SF₆, CFC-12 has no strong meridional gradient in the troposphere around the year 2011. The relatively weak meridional gradient observed for CFC-12 can be attributed to its significantly reduced emissions by 2011, following its global ban in 2010. Similar illustrations of the correlations for the four remaining trace gases can be found in Figs. S1 to S4 in the Supplement.

3.2 Lookup tables to get AoA from mixing ratio

The considered stratospheric air masses from the CLaMS simulation for the four selected dates were separated into the two hemispheres by use of equivalent latitude. Thereafter, the procedure described in Sect. 2.2 has been applied to the dataset of each trace gas, day, and hemisphere to create the lookup table required to identify a given mixing ratio with a corresponding AoA and uncertainty thereof.

Figure 4 shows the results of the aforementioned procedure in the case of CFC-12 for the Southern Hemisphere. Figure A2 in Appendix A shows the corresponding results for the Northern Hemisphere. The green dots represent the scatterplots of mixing ratio drawn against AoA up to 25 km. The transparent black bars mark the 1σ environments around the mean AoA values of the mixing ratio bins (model variability). Note that in some cases the series of black bars do not extend all the way down from the upper to the lower end of the mixing ratio range (e.g., Fig. 4a). This is because one or both of the conditions described in Sect. 2.2 were met (data points become too sparse and/or the gradient becomes too steep) and the respective streak of bins at the beginning or end of the mixing ratio range was ignored during the procedure. The conditions described in Sect. 2.2 ensure that only mixing ratio bins with sufficiently large sample sizes in regions of sufficiently tight correlation with AoA are included in the lookup tables.

The magenta lines in the two figures show the smoothed series of bin midpoints that constitute the lookup tables for AoA. The magenta shading around each of those lines is the uncertainty range of AoA that results from the expected measurement uncertainty (see Table 2). From here on, the uncertainty of AoA that results from the measurement uncertainty of the trace gas will itself simply be referred to as the measurement uncertainty. The blue dots are the same as the green ones but in the altitude range between 25 and 30 km. The comparison between the green and blue dots illustrates the reason for the general altitude limit of 25 km for all days and trace gases. A general height limit was chosen only for the sake of simplicity, and the choice of 25 km as the general height limit seems to assure lookup tables of a reasonable length in all cases. In the case of CFC-12 in the Southern Hemisphere, for instance, the correlation between tracer mixing ratio and AoA probably would not have been compact enough to create a lookup table for October beyond an



Figure 3. Results of the CLaMS simulation up to 25 km at 4 different days in 2011; SF₆ volume mixing ratios are plotted against mean age of air from the clock tracer with a color-coded equivalent latitude.



Figure 4. Green dots: results of the CLaMS simulation up to 25 km in the Southern Hemisphere (equivalent latitude < 0) at 4 different days in 2011; CFC-12 volume mixing ratios are plotted against clock-tracer AoA. Blue dots: same as green dots but in the altitude region between 25 and 30 km. Black boxes: 1σ environment around average AoA in volume mixing ratio bins included in the lookup table (part of uncertainty of AoA that arises from spread of data points). Magenta line: series of bin midpoints (mean AoA/mean mixing ratio) smoothed with a Savitzky–Golay filter (used as lookup table). Magenta shading: part of uncertainty of AoA that arises from measurement of trace gas (estimated with expected uncertainty in Table 2 according to the method illustrated in Fig. 2).

AoA of around 4 years if data between 25 and 30km were included (see Fig. 4d). The complete lookup tables (including measurement uncertainty and model variability) for the remaining five trace gases for the 4 d and two hemispheres were created accordingly, and similar illustrations of them can be found in the Supplement (Figs. S5 to S14).

In the case of actual measurements, AoA and its total uncertainty would be interpolated from the lookup tables for each of the six trace gases separately, and the weighted-mean \overline{AoA} (see Eq. 1) with the combined uncertainty $\overline{\sigma}$ (see Eq. 2) would subsequently be constructed from the results. Before calculating the actual mean AoA values, an initial estimate of the combined uncertainty for AoA values ranging from 1 to 5.5 years was made. This involved assuming that a specific AoA value within the range was uniformly derived from the lookup tables of all six trace gases, implying that all tracers yielded the same AoA value. This value, treated as the weighted-mean AoA, allowed for interpolation of corresponding total uncertainties from each tracer's lookup table. These uncertainties were then used to construct a combined uncertainty $\overline{\sigma}$.

Figure 5 shows the individual total uncertainties of the six trace gases as well as the combined uncertainty over an AoA range between 1 and 5.5 years for the 4 d for the Southern Hemisphere. Figure A3 in Appendix A shows the corresponding results for the Northern Hemisphere. In every case, the combined uncertainty starts at young ages with a peak value between 0.2 and 0.4 years and then gradually decreases with increasing AoA up to around at least 4 years. A gradual increase in the uncertainties for AoA higher than about 4 years is the result of the increasing spread in some of the underlying trace gas species data, which in turn occurs due to depleted mixing ratios at higher altitudes. Higher uncertainties at the lower end of the AoA range can be explained by the flatter gradients of the fitted polynomials. The combined uncertainty stays well below 0.3 years over most of the AoA range in all cases. At ages older than about 4.5 years, sudden steep jumps can be seen in the combined uncertainty. These jumps occur whenever the compact relation between the respective trace gas species and age breaks down (AoA values in the lookup table have reached their limit), and the tracer in question no longer contributes to the weighted mean and its uncertainty.

To further investigate the atmospheric regions where the presented method provides AoA with a given uncertainty, the combined uncertainties from Figs. 5 and A3 are presented as distributions in the latitude–pressure plane. For this mapping, the actual model AoA from the clock tracer in the CLaMS simulation was used to project the uncertainties onto the latitude–pressure plane. In a first step, zonal mean fields of model mean age were calculated, and these mean age fields are shown in Fig. 6 for the altitude range between 10 and 25 km. These zonal mean values were treated as if they were measurement-derived weighted-mean AoA values and were associated with the corresponding combined un-

certainty at the respective day and hemisphere depicted in Figs. 5 and A3.

The created zonal mean distributions of the combined uncertainties at the 4 d are shown in Fig. 7. The white areas in the figure correspond to the regions of zonal mean AoA below 1 year (compare with Fig. 6). Stratospheric air younger than roughly 1 year is located close to the troposphere and may therefore likely be influenced by small amounts of tropospheric air that entered the stratosphere through the extratropical tropopause (Hauck et al., 2020). This is, for example, evident in the comparatively large spread of SF₆ mixing ratios for AoA below roughly 1 year in Fig. 3. The influence of well-mixed tropospheric air can also lead to flat gradients in the required lookup tables, which in turn lead to a high uncertainty of AoA below 1 year (see Figs. 4 and A2). Since air masses influenced by the troposphere are not the focus of this study and since the high uncertainties of their AoA values would only distract from the purely stratospheric air masses, AoA values below 1 year are excluded in Fig. 7 and in all following figures.

As expected from the behavior of the combined uncertainties in Figs. 5 and A3, the uncertainties stay well below 0.3 years in all of the remaining regions of AoA above 1 year and tend to decrease with increasing AoA. On average, the uncertainties appear highest for the austral summer season (1 January) at high southern latitudes, which is likely due to the collapse of the Antarctic polar vortex a few months prior and the subsequent gradual spread of air masses that were contained in the vortex before its collapse.

3.3 AoA from synthetic measurements

Figure 7 represents an estimate of how accurately zonally averaged AoA might be derived from trace gas measurements via the proposed correlation method (see Sect. 2.2) in different regions. In the following, we evaluate the method even more thoroughly by creating pseudo-measurements of the six trace gases from the CLaMS model results and by using these pseudo-measurements to calculate AoA with the correlation method. These calculated AoA values will be compared to the actual model AoA from the clock tracer. The pseudomeasurements were created by adding normally distributed random noise to the mixing ratios of the six trace gases for all air parcels on the 4 considered days. The expected measurement uncertainty in Table 2 was used as the standard deviation of the noise distribution for each trace gas. In the next step, AoA and its total uncertainty were interpolated from the respective lookup table for each of these pseudomeasurements. Thereafter, the weighted-mean AoA and its difference to the clock-tracer AoA were calculated for each model grid point. Finally, zonal mean fields and standard deviations were calculated.

Figure 8 shows the zonally averaged weighted-mean AoA for the four dates under consideration. The thick black lines represent the zonally averaged tropopause, derived from the



Figure 5. Dashed, dotted, and dot-dashed colored lines: individual total uncertainties of the six trace gases in the Southern Hemisphere at the 4 considered days in 2011 over the AoA ranges of the respective lookup tables. Black lines: combined total uncertainty calculated with Eq. (2) from the individual total uncertainties.



Figure 6. Color-coding and contours: zonally averaged AoA from the CLaMS clock tracer in years at the 4 considered days in 2011. Thick black lines: position of the zonally averaged tropopause according to the ERA5 reanalysis for the 4 d (lapse rate tropopause following WMO, 1957). Black box in (c): northward intrusion of young air masses.

daily ERA5 reanalysis data (lapse rate tropopause following WMO, 1957). The white areas correspond to those regions where the zonal mean AoA from the clock tracer of the model in Fig. 6 is below 1 year (tropospheric air). A comparison between both figures reveals that the general shape of the AoA distribution of the model was accurately recreated from the pseudo-measurements. Even the northward intrusion of air with AoA below 1.5 years into the layer of air with AoA between 1.5 and 2 years at roughly 70° N and 14 km height in July is clearly present in the results of the correlation method (compare Figs. 6c and 8c). This intrusion of younger air is likely caused by outflow of the Asian summer monsoon (Ploeger and Birner, 2016; Krause et al., 2018).



Figure 7. Combined total uncertainties in Fig. 5 and A3 mapped onto corresponding zonally averaged clock-tracer AoA in Fig. 6. White areas correspond to regions with actual model AoA from the clock tracer below 1 year (tropospheric air, not shown because of irrelevance and to avoid distraction).



Figure 8. Zonally averaged weighted-mean AoA calculated from the lookup tables for the six trace gases and synthetic measurements created with CLaMS. Thick black lines: position of the zonally averaged tropopause at respective day according to ERA5 reanalysis (lapse rate tropopause following World Meteorological Organization (WMO, 1957). White areas correspond to regions with actual model AoA from the clock tracer below 1 year (tropospheric air, not shown because of irrelevance and to avoid distraction). Black box in (c): northward intrusion of young air masses.

Figure 9 shows the zonally averaged differences between the pseudo-measurement-derived AoA and the clock-tracer AoA for the 4 d. The white areas are identical to those in Fig. 8. On all 4 d, the absolute difference stays well below ± 0.3 years in almost every region and does not surpass ± 0.5 years anywhere. The absolute difference reaches its highest values around 0.3 years at the upper end of the height scale. These comparatively high values are most likely the result of high AoA values near the end of the lookup tables, for which the uncertainties for the individual tracers, as well as

the combined uncertainty of the weighted mean, tend to increase (compare Fig. 8 with Figs. 5 and A3). However, given that AoA values in these areas are particularly high, the relative difference between both types of AoA does not increase all that much and stays below 10%. The relative differences reach their highest values in the region near the tropopause, where AoA values are low and where flat gradients inside the lookup tables cause increased uncertainties (compare Figs. 4, A2, 5, A3, and 8).

Figure 10 presents the standard deviations in the zonal direction of the differences between pseudo-measurement and clock-tracer AoA. These standard deviations quantify the spread of AoA differences in the zonal direction and can be used to estimate the uncertainty of AoA derived from individual measurements at different longitudes for any latitude. If the zonally averaged differences in AoA shown in Fig. 9 were uniformly zero, the standard deviations in Fig. 10 could directly represent these uncertainties. In such a scenario, Fig. 10 would closely resemble the initial uncertainty estimate in Fig. 7. However, as the differences in Fig. 9 are not uniformly zero, the two figures differ slightly. Specifically, the values in Fig. 9 are higher near the tropopause and toward the top of the height scale across all 4 d. To estimate the total uncertainty of AoA derived from individual measurements, the zonally averaged differences in AoA and the standard deviations in Fig. 10 must be combined as a rootmean-square error (RMSE). This calculation yields an average uncertainty of approximately 0.3 years for AoA at any latitude and longitude across the 4 d. A graphical depiction of the expected uncertainty for AoA derived from individual measurements is provided in Fig. S29.

3.4 Application to GLORIA balloon data

Figure 11 shows the mean AoA profiles derived for the two GLORIA-B balloon flights as described in Sect. 2.3. The solid blue lines (GLORIA-B standard method) represent AoA calculated from observed SF_6 mixing ratios with the standard convolution method, as described in Garny et al. (2024b), and with the subsequent correction for SF_6 -depleted air from the mesosphere introduced by Garny et al. (2024a).

In the standard convolution method, the mean AoA spectrum is modeled using an inverse Gaussian distribution. This distribution is fully defined by its first two moments: the mean (AoA) and the width (Δ). Alternatively, the inverse Gaussian can be specified using AoA and the ratio of its first two moments (rom = $\frac{AoA}{\Delta}$). Importantly, the ratio of moments (rom) remains relatively stable over time at a given location and can be determined from model-based or measurement-based lookup tables. Once the ratio of moments is known, the inverse Gaussian can be constructed for a range of AoA values. The method involves convolving the tropospheric SF₆ time series with the generated inverse Gaussian distributions. The AoA value corresponding to the convolution result that best matches an observed SF₆ mixing ratio is then selected as the final estimate. Due to the unimodal nature of the inverse Gaussian distribution, the standard convolution method cannot resolve additional modes in the mean AoA spectrum that may arise from the seasonality of the BDC. The AoA correction for SF₆-depleted air from the mesosphere is derived using a least-squares fit of an exponential function to global model results, establishing a relationship between uncorrected and actual AoA. While the uncertainty of this correction method increases with AoA, it is optimized for AoA values up to 5 years. Despite this limitation, the method continues to enhance the accuracy of results even for AoA values exceeding 5 years.

The horizontal dot-dashed gray lines mark the limit where the correction method for mesospheric depletion becomes less accurate as the uncorrected AoA exceeds the stated limit of 5 years (Garny et al., 2024a).

The shaded blue areas around the GLORIA-B standard method AoA represent its uncertainty range (see Sect. 2.3). The solid magenta lines (GLORIA-B new method) represent the weighted-mean AoA calculated from the observed mixing ratios of the six selected trace gases listed in Table 2 via the proposed correlation method (see Eq. 1). The required lookup tables to identify each of the six trace gases with corresponding AoA and uncertainty were created from the CLaMS results for the Northern Hemisphere and the day of the respective balloon launch (Kiruna: 21 August 2021, Timmins: 23 August 2022). These lookup tables were created in exactly the same way as the ones for the 4 d in 2011 discussed in Sect. 3.2. Illustrations similar to those in Fig. A2 for the lookup tables at the 2 flight days can be found in Figs. S15 and S16. However, instead of the estimated measurement uncertainties of the CAIRT instrument in Table 2, the actual uncertainties of the GLORIA-B instrument for the measurement and temporal averaging of each trace gas were used to estimate the measurement part of the total AoA uncertainty. The magenta shading around the GLORIA-B new method AoA represents its uncertainty according to Eq. (2). A comparable AoA profile has been calculated from the CLaMS model mixing ratios of the six species interpolated on the measurement locations (dashed magenta lines), and these are shown together with the actual model age profiles from the model clock tracer (dashed black lines). The shaded black areas around the CLaMS clock-tracer AoA represent the standard deviations of the actual model AoA along the recreated points of observation.

The comparison of the CLaMS clock-tracer AoA with the CLaMS new method AoA shows that the new correlation method produces reliable results for both flights, such that inferred mean age agrees very well with the model clock-tracer age. For either flight, the standard deviation of the actual CLaMS AoA from the clock tracer does not exceed half a year, and the difference between the two model AoA profiles is even smaller at most height levels. Hence, the new correlation method passes the proof of concept in the con-



Figure 9. Zonally averaged difference between weighted-mean AoA (from synthetic measurements with lookup tables) and actual CLaMS AoA (from clock tracer) in latitude–altitude plane for the 4 d in 2011. Thick black lines: position of the zonally averaged tropopause at respective day according to ERA5 reanalysis (lapse rate tropopause following WMO, 1957). White areas correspond to regions with actual model AoA from the clock tracer below 1 year (tropospheric air, not shown because of irrelevance and to avoid distraction).



Figure 10. Standard deviations of differences between weighted-mean AoA (from synthetic measurements with lookup tables) and actual CLaMS AoA (from clock tracer) in the zonal direction for the 4d in 2011. Note that the differences are calculated before the standard deviations. Thick black lines: position of the zonally averaged tropopause at the respective day according to the ERA5 reanalysis (lapse rate tropopause following WMO, 1957). White areas correspond to regions with actual model AoA from the clock tracer below 1 year (tropospheric air, not shown because of irrelevance and to avoid distraction).

sistent model environment as well as when applied to single balloon profiles.

The values of the GLORIA new method fall entirely within the uncertainty range of the GLORIA standard method AoA for both flights, but the reverse is true only for the flight from Kiruna below roughly 22 km. Furthermore, the two profiles for the flight from Kiruna seem to agree much better with each other than for the flight from Timmins. For the Timmins flight, on the other hand, the GLORIA standard method is up to 1 year older and lies outside the uncertainty range of the GLORIA new method over nearly the entire height range. However, given the extraordinarily high uncertainty of the GLORIA-B standard method, any conclusions drawn from the corresponding values are hardly meaningful. Note that the aforementioned high uncertainty in AoA is the result of the high measurement uncertainty of SF₆. A possible explanation for the higher difference between the two profiles for the Timmins flight could be that the air masses scanned by GLORIA-B were influenced by SF₆depleted air from the mesosphere to a higher degree compared to the Kiruna flight, and this was not fully compensated by the applied SF₆ sink correction. At least for the results in the last roughly 4 km of the height scale, which are above the recommended limit for the application of the SF₆ sink correction, this explanation seems plausible. Another possible explanation would be some issue with the instrument during the Timmins flight that led to the retrieval of SF_6 mixing ratios that are systematically too low. There is, however, no indication of what could have caused such an issue thus far.

Overall, a clear improvement in the new age calculation method using tracer correlations is the substantial reduction in AoA uncertainty - from several years to around half a year – across nearly the entire height range for both flights. The two profiles of the GLORIA-B new method are also in good agreement with the recently published AoA profiles by Schuck et al. (2024b). In their study, Schuck et al. (2024b) calculated AoA values using cryogenic whole-air samples of SF₆ and CO₂ collected in Kiruna, Sweden, during August 2021. Similar to the AoA profiles of the GLORIA-B new method, the results reported by Schuck et al. (2024b) exhibit an increase in AoA with altitude, reaching approximately 5 years at around 22km. Beyond this altitude, the AoA values remain approximately constant at their maximum of 5 years. There are good reasons to believe that the utilized model-based lookup tables do reflect the actual atmospheric conditions well enough to justify their application to the GLORIA-B measurements. These reasons will be discussed in the next section. On top of that, an alternative to the model in the form of global satellite measurements as the foundation of the lookup tables will also be discussed in the next section.

Comparison between model and measurement-based age of air in Fig. 11 further shows that the results of the new correlation-based method applied to the two different sets of measurements by GLORIA-B are consistently higher than



Figure 11. Mean-AoA-height profiles along measurement locations during balloon launches of GLORIA-B from Kiruna, Sweden (a), and Timmins, Canada (b). Blue lines: AoA with standard method (Garny et al., 2024b) and sink correction (Garny et al., 2024a) from SF₆ observations. Blue shading: uncertainty ranges of blue lines from uncertainty of mean SF₆-height profiles. Solid magenta lines: AoA with new correlation-based method (see Eq. 1) from observations of selected tracers (see Table 2) and lookup tables created from CLaMS (see Figs. S15 and S16) with actual measurement uncertainties instead of estimated ones (see Table 2). Magenta shading: uncertainty ranges of magenta lines (see Eq. 2). Dashed magenta lines: same as solid magenta lines but from the CLaMS results interpolated on measurement locations. Dashed black lines: actual CLaMS AoA from modeled clock tracer. Black shading: 1 standard deviation around the respective mean values that constitute dashed black lines. Gray horizontal dot-dashed lines: recommended height limit for SF₆ sink correction at which uncorrected AoA from the standard method exceeds 5 years (Garny et al., 2024b).

the model results up to around 22 km. Hence, the stratospheric BDC in the ERA5 reanalysis-driven CLaMS simulation appears to be significantly slower compared to the observations. This result is in agreement with a generally slower BDC in ERA5 compared to other reanalyses and observations as found by Ploeger et al. (2021) and Laube et al. (2020). It should be noted that this slow bias of the ERA5 circulation in the comparison presented here is independent of the age calculation method used.

3.5 AoA from synthetic measurements with zonally averaged correlations

For a given satellite instrument, it can be more reliable to derive trace gas mixing ratios for the zonal mean than for individual profiles (e.g., Stiller et al., 2012). Therefore, we apply the new correlation-based method to calculated AoA for zonal mean data in the following and further discuss its applicability in Sect. 4. For each of the four considered dates in 2011 (1 January, 1 April, 1 July, and 1 October), zonal mean fields for trace gas mixing ratios and clock-tracer AoA values have been calculated from the CLaMS model data. Lookup tables to obtain AoA from mixing ratios were then created from these zonal mean fields in the same way as

3556

for the 3-D data in Sect. 3.2 and as described in Sect. 2.2 (see Figs. 4 and A2). Just like in Sect. 3.2, one lookup table for each trace gas, day, and hemisphere was created, making 48 lookup tables in total. These lookup tables from the zonal mean fields were then used to calculate weighted-mean AoA from the previously calculated 3-D (zonally dependent) synthetic measurements of the six trace gases using Eq. (1). These weighted-mean AoA of the model obtained from the clock tracer. The evaluation was done in the same way as before for the weighted-mean AoA calculated from the lookup tables created from the full 3-D dataset (see Sect. 3.3).

Figure 12 shows (exemplarily for 1 July 2011) the different steps in the calculation and evaluation of the weightedmean AoA for the calculation based on zonal mean data. Figure 12a shows one example from the 48 lookup tables created from the zonal mean fields: the one for CFC-12 in the Southern Hemisphere. The equivalent lookup table from the original CLaMS datasets can be seen in Fig. 4c. Note that the number of mixing ratio bins was reduced from 150 to 40 for the lookup tables from the zonal mean fields. A smaller number of bins was necessary because of the significant reduction of data points caused by the zonal averaging. Graphical depictions of the lookup tables for the remaining cases can be found in Figs. S17 to S28.

Figure 12b shows the individual total uncertainties of AoA from the lookup tables of the six trace gases in the Southern Hemisphere as well as their combined uncertainty calculated with Eq. (2) (see Figs. S30 and S31 for Northern Hemisphere and remaining days). This figure corresponds to Fig. 5c, which shows the respective uncertainties from the lookup tables created from the original CLaMS data sets.

The lookup tables from the zonal mean fields were applied to the 3-D synthetic trace gas measurements to create a weighted-mean AoA for every model grid point. Thereafter, the differences between these weighted-mean AoA values and the corresponding actual AoA values from the clock tracer of the model were calculated, and the mean values and standard deviations of these differences in the zonal direction were constructed. The weighted-mean AoA values were zonally averaged as well, the result of which is shown in Fig. 12c (see Fig. S32 for remaining days). The AoA distribution in Fig. 12c is essentially the same as the corresponding one from the full 3-D CLaMS dataset in Fig. 6.

Figure 12d shows the zonally averaged differences between the weighted-mean AoA and the actual AoA of the model (see Fig. S33 for remaining days). The differences displayed in Fig. 12c are similar in size and distribution to the corresponding ones from the non-averaged CLaMS datasets shown in Fig. 8c. The average difference is slightly higher in the case of the lookup tables from zonal mean data, at 0.06 years, than in the case of the lookup tables from the non-averaged, where it is 0.02 years, but these differences are very minor. Figure 12e shows the standard deviations in the zonal direction of the difference between actual model and weightedmean AoA (see Fig. S34 for remaining days). These standard deviations are also remarkably similar to the corresponding ones of the full zonally dependent calculation (Fig. 10).

Figure 12f is the result of Fig. 12d and e added together as a RMSE (color coding, not contours) and represents an estimation for the zonally averaged uncertainty of the weightedmean AoA (see Fig. S35 for the remaining days). In other words, if the uncertainties of the weighted-mean AoA values (see Eq. 2) were zonally averaged, the results should closely resemble the color-coded values in Fig. 12f. Figure S29 is the correspondence to Fig. 12f for the lookup tables from the non-averaged CLaMS data. Since there are also no major differences between the two cases in this final uncertainty estimation, it can be concluded that estimation of the relation between trace gas mixing ratio and mean age from zonal mean data yields just as reliable results than the estimation from the full 3-D data. This conclusion can be drawn for all 4 d considered (see the respective figures in this article and the Supplement).

4 Discussion

4.1 Toward an application for satellite measurements

The proposed method to derive AoA requires knowledge of its functional relations with respect to mixing ratios of certain trace gases. In a model environment, where the true AoA values are known, these functional relations can be easily established. It is, however, unclear how well such model-based relations might reflect the actual conditions in the real atmosphere. Therefore, it is preferable to establish the required functional relations directly from the satellite measurements itself rather than from model results.

For that purpose, we suggest to first calculate AoA from SF₆ with well-established standard methods like the convolution method proposed by Garny et al. (2024b) in combination with the SF_6 sink correction by Garny et al. (2024a), as a first guess. Given the difficulty in retrieving SF_6 from satellite measurements, this first-guess AoA would be afflicted with significant uncertainties that make interpretations of individual values impossible. In order to reduce the measurement noise, the first-guess AoA is likely possible only for data averaged over larger areas (e.g., zonal mean data). The required lookup tables could be calculated from the averaged first-guess AoA and likewise averaged mixing ratios with a method similar to the one described in Sect. 2.2. The thus established lookup tables could then be used to calculate weighted-mean AoA at the individual points of observation inside the respective areas. The necessary size of these areas (e.g., the length of longitude ranges for zonal averaging) will depend on the amplitude of the noise in future satellite measurements of SF₆ and needs to be specifically defined for the satellite instrument considered.



Figure 12. Selection of plots exemplifying the analysis in Sect. 3.3 for lookup tables created from zonally averaged CLaMS results. All plots refer to 1 July 2011. The bold black lines in (c) to (f) indicate the zonally averaged tropopause according to the ERA5 reanalysis (lapse rate tropopause following WMO, 1957). (a) Creation of lookup table for zonal mean AoA from zonal mean CFC-12 in the Southern Hemisphere (see Figs. 4 and A2). (b) Dashed, dotted, and dot-dashed colored lines: total uncertainty of each tracer in the Southern Hemisphere. Solid black line: combined total uncertainty for all tracers according to Eq. (2) (see Figs. 5 and A3). (c) Zonally averaged weighted-mean AoA from synthetic measurements with lookup tables (see Fig. 8). (d) Zonally averaged difference between weighted-mean AoA from synthetic measurements and CLaMS clock tracer (see Fig. 9). (e) Standard deviations of zonally averaged differences between weighted-mean and clock-tracer AoA (see Fig. 10). Note that the differences are calculated before the standard deviations. (f) Estimation of uncertainty of weighted-mean AoA from lookup tables along all longitudes (values in (d) and (e) added together as a RMSE).

In the case of a large SF_6 measurement uncertainty, the first-guess AoA would have to be calculated for averages over the entire longitude range (zonal mean data) to reach a sufficient reduction in noise to enable the construction of the required lookup tables. On the basis of observations by MIPAS, Stiller et al. (2012) have demonstrated that reliable zonal mean AoA values can in fact be derived from existing satellite measurements of SF_6 . The results in Sect. 3.5 suggest that it should be possible to derive AoA with an uncertainty of just a few percent even from zonal mean trends in most of the lower stratosphere throughout the year. For future satellite measurements with further reduced uncertainty

in the SF_6 retrieval, it is to be expected that the areas for the necessary averaging can be further reduced and that the accuracy of the estimated AoA can be further increased.

4.2 Further improvements

This study presents a proof of concept that AoA could potentially be derived more accurately and with higher spatial and temporal resolutions from satellite measurements if trace gases other than SF_6 were taken into account, as well. In order to make the general idea of deriving AoA from correlations of trace gases with AoA easier to understand, a relatively simple method was developed in this study. Several measures to improve this simple method could be worth exploring before employing it on actual satellite observations. One potential way the method might be improved could be a separation of data points into narrower latitude bands than just the two hemispheres considered here. It might, for instance, be preferable to consider the tropical latitudes separately, since these constitute unique regions in terms of dynamics that are characterized by fast upwelling. A separation into different altitude bands might also be a valuable improvement of the method.

Another way the presented method might be improved is by including a larger number of trace gas species. Additional trace gas species to the ones considered in this study with long stratospheric lifetimes might also show sufficiently compact correlations with AoA in the lower stratosphere. Including more trace gases with such compact correlations would be useful to further reduce the uncertainty of AoA derived with the presented method. However, all these species need to be retrieved from satellite observations with reasonably low uncertainty. Potential trace gases with the required properties could include certain species of chlorofluorocarbons (CFCs), hydrochlorofluorocarbons (HCFCs), hydrofluorocarbons (HFCs), and per fluorocarbons (PFCs).

4.3 Model and method uncertainties

This study should, first and foremost, be viewed as a proof of concept for the proposed method to calculate AoA. Such a proof of concept can only be demonstrated within the perfectly self-consistent environment of a model, where the true values of the desired quantity are already known. Since no model is a perfect representation of the actual atmosphere, the lookup tables required for applying the proposed method should ideally be constructed directly from measurements, as laid out in Sect. 4.1, rather than from model results. Due to the lack of suitable measurement data, we had to establish the lookup tables required for applying the method to the GLORIA-B data using the available model results. We are confident that the CLaMS-based lookup tables used on the GLORIA-B data represent the actual atmospheric conditions reasonably well, and we find the AoA profiles derived from these lookup tables to be more plausible than the corresponding ones derived with the standard method (see Fig. 11). Our confidence in the CLaMS-based lookup tables stems from the following three reasons:

- 1. The reliability of the CLaMS model for the utilized trace gases has been demonstrated in previous studies (see Laube et al., 2020, for CFC-11, CFC-12, and HCFC-22; Konopka et al., 2004, for CH₄; and Pommrich et al., 2014, for N₂O).
- 2. There is excellent agreement between the AoA profiles reported by Schuck et al. (2024b) and those derived using the proposed method from the GLORIA-B mea-

surements at Kiruna (see Fig. 11). The balloon-borne air samples collected by Schuck et al. (2024b) should closely resemble the air masses observed by GLORIA-B during its first flight, as both balloon flights took place in August 2021 in Kiruna, Sweden. The fact that Schuck et al. (2024b) obtained similar results for comparable air masses using a different calculation method strongly supports our expectation that the utilized CLaMS-based lookup tables reflect the conditions of the actual atmosphere reasonably well.

3. The upper boundary region, arguably the biggest source of bias in the simulation as a whole, seems to have only limited impact on the model tracer mixing ratios in the considered altitude region (i.e., below 25 km). Figure A4 in Appendix A shows the temporally averaged zonal mean SF₆ distribution of the model results up to the upper boundary over two different 3-month periods. Figure 11a shows the average distribution from December 2010 to February 2011, representing winter in the Northern Hemisphere, and Fig. 11b shows the average distribution from June to August 2011, representing winter in the Southern Hemisphere. The winter periods were chosen because they represent the time when the downward transport of air from higher altitudes by the deep branch of the BDC is strongest in the respective hemisphere. SF₆ was selected because, in relative terms, it reaches the upper boundary with higher amounts than all other tracers (due to the absence of a stratospheric sink). Out of all model results, the influence of the upper boundary is therefore expected to be strongest for SF_6 during winter in the respective hemisphere. Figure 11 suggests that the downward transport of SF₆-depleted air from the upper boundary only seems to have an affect below 25 km at high latitudes in the winter hemisphere. This limited influence of the upper boundary on model results below 25 km could partly be related to the slower stratospheric circulation in ERA5 compared to other reanalyses, as pointed out in Sect. 3.4. This slow bias, however, effects the six long-lived trace gases in the same way as the model clock tracer and therefore cannot be responsible for any biases that the modelbased lookup tables might have.

While these considerations give us confidence in the plausibility of the CLaMS-based lookup tables, it is important to emphasize that a thorough analysis would be necessary to fully assess the influence of the upper boundary on each of the six trace gases specifically and to evaluate the extent on which the derived lookup tables reflect the conditions of the real atmosphere. Such an analysis would ideally involve the use of several atmospheric models and/or reanalysis datasets to better quantify potential biases and uncertainties. Additionally, the influence of uncertainties in the kinetic model parameters, such as photochemical data and modelcalculated loss rates, on AoA cannot be ruled out. A thorough analysis of the influence of these uncertainties on AoA would also be needed. However, conducting such extensive analyses is beyond the scope of this study.

5 Conclusions

We have introduced a new method to derive stratospheric AoA from tracer mixing ratios in order to reduce the high uncertainty that arises when stratospheric AoA is derived from remote sensing observations using a common standard method. The standard method to calculate AoA from trace gas observations is only applicable for trace gases that approximate an ideal clock tracer sufficiently well. The only approximate clock tracer that has been retrieved from satellite observations within a sufficiently meaningful uncertainty range is SF₆ (Stiller et al., 2008). The uncertainty of retrieved SF₆ is, however, still significant. Standard methods (Garny et al., 2024b) have therefore, until now, only been applied on zonally averaged satellite measurements of SF₆. The new correlation-based method to calculate AoA introduced in this study is an attempt to make use of the full spatial resolution of satellite observations and to avoid the necessity to restrict to zonal mean data. With this new method, AoA can be derived from any trace gas that holds a compact correlation with AoA in the stratosphere and not just from approximate clock tracers like SF₆. Using other trace gas species in addition to SF₆ to derive AoA has the advantage that the uncertainty associated with the AoA estimate gets reduced with every new species with sufficiently high accuracy added. Although the methods to derive AoA proposed by Leedham Elvidge et al. (2018) and Ray et al. (2024) also use other trace gases in addition to SF₆, they are not applicable on typical remote sensing measurements, because they rely on trace gases that cannot be retrieved without a significant uncertainty.

The applicability of the new method introduced in this study for atmospheric remote sensing observations has been demonstrated based on balloon-borne measurements. The application of the new method produced significantly lower AoA uncertainties than the application of the standard method, and the results for the new method fell entirely within the uncertainty range of the results for the standard method. Comparison of mean age from the balloon-borne measurements with ERA5 reanalysis-driven model simulations showed that the new correlation-based method provides mean age profiles with sufficiently reduced uncertainty compared to standard methods to truly enable constraining the model. Consequently, it could be shown that the stratospheric circulation in the ERA5 reanalysis data is slower than the actual stratospheric circulation in the real atmosphere. Furthermore, it is still an open question whether or not - and if so where exactly and to what degree - the BDC will accelerate due to the changing climate and the associated warming of the troposphere and cooling of the stratosphere. Age of air datasets calculated from observations with the new correlation method could be used to validate simulated circulation trends. Furthermore, such datasets could be invaluable for studying exchange processes between the troposphere and the stratosphere. These studies have wideranging applications in atmospheric science, including but not limited to understanding the transport of water vapor and other trace gases, investigating the impact of stratospheric ozone on climate, assessing the influence of tropospheric pollutants on stratospheric chemistry, and helping to better constrain emissions of various substances (including prohibited ones like CFCs).

It was demonstrated on the basis of model output from CLaMS that the new method produced reliable zonal average AoA distributions in the lower stratosphere. These retrieved age distributions even showed smaller-scale variations consistent with the actual AoA from the clock tracer like a layer of relatively young AoA at higher altitudes in the Northern Hemisphere summer lowermost stratosphere caused by the outflow of the Asian summer monsoon. The analysis with CLaMS also showed the potential usefulness of the new method for deriving AoA on individual satellite observation points in the lower stratosphere throughout the year. The average uncertainty of AoA derived with the new method is expected to be around 0.3 years at any day and location. The application of the new correlation-based method to derive AoA on future limb-imaging satellite observations such as CAIRT could therefore provide spatially resolved global distributions of AoA in the lower stratosphere with significantly reduced uncertainty. Such datasets do not exist up to this point and are urgently needed to enhance our understanding of transport processes in the stratosphere and to study the effects of these processes by improving their representation in climate models.

Appendix A



Figure A1. Same as Fig. 3 but for CFC-12 instead of SF⁶.



Figure A2. Same as Fig. 4 but for the Northern Hemisphere.



Figure A3. Same as Fig. 5 but for the Northern Hemisphere.



Figure A4. Zonal mean SF₆ mixing ratio from the CLaMS results from the tropopause to stratopause region averaged over a 3-month period. (a) Averaged over December of 2010 and January and February of 2011. (b) Averaged over June, July, and August of 2011. Dashed blue line: upper limit for applicability of proposed method to calculate AoA. White line: zonal mean tropopause from the ERA reanalysis averaged over the respective 3-month period (lapse rate tropopause following WMO, 1957).

Code and data availability. The CLaMS models are available in the Modular Earth Submodel System (MESSy) Git database at https://gitlab.dkrz.de/users/sign_in (MESSy Consortium, 2025, login required). Detailed information is available at https: //messy-interface.org/licence/application (last access: 3 March 2025). The implementation of the CLaMS model into the MESSy framework is available at https://doi.org/10.5194/gmd-7-2639-2014 (Hoppe et al., 2014). ERA5 reanalysis data are available from the European Centre for Medium-Range Weather Forecasts (https://doi.org/10.24381/cds.adbb2d47, Hersbach et al., 2023). The CLaMS model data used for this paper may be requested from the corresponding author (f.ploeger@fz-juelich.de). The lookup tables created for this study are available online at https://doi.org/10.5281/zenodo.14543944 (Voet, 2024). **Supplement.** The supplement related to this article is available online at https://doi.org/10.5194/acp-25-3541-2025-supplement.

Author contributions. FV performed the investigation, data analysis, data curation, and visual representation; FP, JL, and PP initiated the study, conceptualized the core research questions, and contributed to writing the manuscript; PK developed the setup for the CLaMS simulation; JUG implemented the new trace gas species SF₆ and HCFC-22 in the CLaMS model; JL helped to develop the lower and upper boundary conditions of the six trace gases; PP and JU developed the new method for calculating AoA; ER contributed to developing the new method for calculating AoA by conceiving a significant improvement to the original idea; GS provided the MI-

PAS datasets for SF_6 and AoA that were used to create the upper boundary condition of SF_6 , as well as the initial mixing ratio distributions of SF_6 , CH_4 , N_2O , and HCFC-22 in the CLaMS simulation; JU, MH, GW, and SJ performed the processing of the GLORIA-B data; GW and SJ have provided the mixing ratio profiles with uncertainties for the balloon launches of GLORIA-B. All co-authors contributed to discussions and to finalizing the paper.

Competing interests. At least one of the (co-)authors is a member of the editorial board of *Atmospheric Chemistry and Physics*. The peer-review process was guided by an independent editor, and the authors also have no other competing interests to declare.

Disclaimer. Publisher's note: Copernicus Publications remains neutral with regard to jurisdictional claims made in the text, published maps, institutional affiliations, or any other geographical representation in this paper. While Copernicus Publications makes every effort to include appropriate place names, the final responsibility lies with the authors.

Acknowledgements. The authors extend their deepest gratitude to the Centre National d'Études Spatiales (CNES) for their invaluable role in executing the balloon launches of the GLORIA-B instrument from Kiruna, Sweden, and Timmins, Canada. These operations were carried out under the auspices of the HEMERA research infrastructure, supported by the Horizon 2020 framework program of the European Union. We also wish to acknowledge the entire GLORIA team for their dedication and expertise, with special thanks to the Institute of Technology and Engineering (ITE) at Forschungszentrum Jülich and the Institute for Data Processing and Electronics at the Karlsruhe Institute of Technology, whose efforts were instrumental in obtaining the measurement results utilized in this study. Our sincere thanks go to the Global Monitoring Laboratory of the National Oceanic and Atmospheric Administration (NOAA) for providing the essential mixing ratio time series that served as the lower boundary conditions in the CLaMS simulation. We also gratefully acknowledge the MIPAS team for supplying the SF₆ and AoA datasets, which were crucial for initializing the CLaMS simulation and defining the upper boundary condition for SF₆. We would like to express our appreciation to Nicole Thomas and Patrick Jöckel for their support and assistance in setting up the model simulations. Finally, we are deeply grateful for the computing time granted on the supercomputer JUWELS at the Jülich Supercomputing Centre (JSC), provided under the VSR project ID CLAMS-ESM, which was vital for the completion of the CLaMS simulations.

Financial support. This study was funded by the Deutsche Forschungsgemeinschaft (DFG, German Research Foundation) – QUANTITEE – (grant no. 462476233) and supported by the European Space Agency (ESA) via the MAGIC-4AMPAC (under ESA contract no. 4000138370/22/NL/SD) and CAIRTEX projects (under ESA contract no. 4000141036/23/NL/FF/ab) and the Per-ReC (CAIRT Phase A Mission Performance and Requirement Consolidation) under ESA contract no. 4000136480/21/NL/LF. Bernd

Funke has been supported by the Agencia Estatal de Investigación (grant no. PID2022-141216NB-I00/AEI/10.13039/501100011033) and the Severo Ochoa grant no. CEX2021-001131-S funded by MCIN/AEI/10.13039/501100011033.

Review statement. This paper was edited by John Plane and reviewed by Simon Chabrillat and one anonymous referee.

References

- Becker, G., Grooß, J.-U., McKenna, D. S., and Müller, R.: Stratospheric photolysis frequencies: Impact of an improved numerical solution of the radiative transfer equation, J. Atmos. Chem., 37, 217–229, 2000.
- Brown, A. T., Volk, C. M., Schoeberl, M. R., Boone, C. D., and Bernath, P. F.: Stratospheric lifetimes of CFC-12, CCl₄, CH₄, CH₃Cl and N₂O from measurements made by the Atmospheric Chemistry Experiment-Fourier Transform Spectrometer (ACE-FTS), Atmos. Chem. Phys., 13, 6921–6950, https://doi.org/10.5194/acp-13-6921-2013, 2013.
- Burkholder, J. B., Sander, S. P., Abbatt, J. P. D., Barker, J. R., Cappa, C., Crounse, J. D., Dibble, T. S., Huie, R. E., Kolb, C. E., Kurylo, M. J., Orkin, V. L., Percical, C. J., Wilmouth, D. M., and Wine, P. H.: Chemical kinetics and photochemical data for use in atmospheric studies, Evaluation Number 19, JPL Publication 19-5, http://jpldataeval.jpl.nasa.gov (last access: 28 Febraury 2025), 2019.
- Butchart, N.: The Brewer-Dobson circulation, Rev. Geophys., 52, 157–184, https://doi.org/10.1002/2013RG000448, 2014.
- Chabrillat, S., Vigouroux, C., Christophe, Y., Engel, A., Errera, Q., Minganti, D., Monge-Sanz, B. M., Segers, A., and Mahieu, E.: Comparison of mean age of air in five reanalyses using the BAS-COE transport model, Atmos. Chem. Phys., 18, 14715–14735, https://doi.org/10.5194/acp-18-14715-2018, 2018.
- Dubé, K., Tegtmeier, S., Ploeger, F., and Walker, K. A.: Hemispheric asymmetry in recent stratospheric age of air changes, Atmos. Chem. Phys., 25, 1433–1447, https://doi.org/10.5194/acp-25-1433-2025, 2025.
- Dutton, G., Hall, B., Dlugokencky, E., Lan, X., Nance, J., and Madronich, M.: Combined Atmospheric Nitrous Oxide Dry Air Mole Fractions from the NOAA GML Halocarbons Sampling Network, 1977–2022, NOAA GML [data set], https://doi.org/10.15138/GMZ7-2Q16, 2022a.
- Dutton, G., Hall, B., Montzka, S., and Nance, J.: Combined Atmospheric Chloroflurocarbon-11 Dry Air Mole Fractions from the NOAA GML Halocarbons Sampling Network, 1977–2022, NOAA GML [data set], https://doi.org/10.15138/BVQ6-2S69, 2022b.
- Dutton, G., Hall, B., Montzka, S., and Nance, J.: Combined Atmospheric Chloroflurocarbon-12 Dry Air Mole Fractions from the NOAA GML Halocarbons Sampling Network, 1977–2022, NOAA GML [data set], https://doi.org/10.15138/PJ63-H440, 2022c.
- Dutton, G., Hall, B., Dlugokencky, E., Lan, X., Nance, J., and Madronich, M.: Combined Atmospheric Sulfur hexafluoride Dry Air Mole Fractions from the NOAA GML Halocar-

bons Sampling Network, NOAA GML [data set], 1995–2023, https://doi.org/10.15138/TQ02-ZX42, 2023.

- Engel, A., Möbius, T., Bönisch, H., Schmidt, U., Heinz, R., Levin, I., Atlas, E., Aoki, S., Nakazawa, T., Sugawara, S., Moore, F., Hurst, D., Elkins, J., Schauffler, S., Andrews, A., and Boering, K.: Age of stratospheric air unchanged within uncertainties over the past 30 years, Nat. Geosci., 2, 28–31, 2009.
- Engel, A., Bönisch, H., Ullrich, M., Sitals, R., Membrive, O., Danis, F., and Crevoisier, C.: Mean age of stratospheric air derived from AirCore observations, Atmos. Chem. Phys., 17, 6825– 6838, https://doi.org/10.5194/acp-17-6825-2017, 2017.
- ESA: Report for Assessment: Earth Explorer 11 Candidate Mission CAIRT, Tech. Rep. ESA-EOPSM-CAIR-RP-4372, European Space Agency, Noordwijk, The Netherlands, https:// atpi.eventsair.com/ucm2023/ucm-doc (last access: 28 February 2025), 2023.
- Fischer, H., Birk, M., Blom, C., Carli, B., Carlotti, M., von Clarmann, T., Delbouille, L., Dudhia, A., Ehhalt, D., Endemann, M., Flaud, J. M., Gessner, R., Kleinert, A., Koopman, R., Langen, J., López-Puertas, M., Mosner, P., Nett, H., Oelhaf, H., Perron, G., Remedios, J., Ridolfi, M., Stiller, G., and Zander, R.: MI-PAS: an instrument for atmospheric and climate research, Atmos. Chem. Phys., 8, 2151–2188, https://doi.org/10.5194/acp-8-2151-2008, 2008.
- Friedl-Vallon, F., Gulde, T., Hase, F., Kleinert, A., Kulessa, T., Maucher, G., Neubert, T., Olschewski, F., Piesch, C., Preusse, P., Rongen, H., Sartorius, C., Schneider, H., Schönfeld, A., Tan, V., Bayer, N., Blank, J., Dapp, R., Ebersoldt, A., Fischer, H., Graf, F., Guggenmoser, T., Höpfner, M., Kaufmann, M., Kretschmer, E., Latzko, T., Nordmeyer, H., Oelhaf, H., Orphal, J., Riese, M., Schardt, G., Schillings, J., Sha, M. K., Suminska-Ebersoldt, O., and Ungermann, J.: Instrument concept of the imaging Fourier transform spectrometer GLORIA, Atmos. Meas. Tech., 7, 3565– 3577, https://doi.org/10.5194/amt-7-3565-2014, 2014.
- Garcia, R. R., Dunkerton, T. J., Lieberman, R. S., and Vincent, R. A.: Climatology of the semiannual oscillation of the tropical middle atmosphere, J. Geophys. Res., 102, 26019–26032, 1997.
- Garny, H., Eichinger, R., Laube, J. C., Ray, E. A., Stiller, G. P., Bönisch, H., Saunders, L., and Linz, M.: Correction of stratospheric age of air (AoA) derived from sulfur hexafluoride (SF6) for the effect of chemical sinks, Atmos. Chem. Phys., 24, 4193– 4215, https://doi.org/10.5194/acp-24-4193-2024, 2024a.
- Garny, H., Ploeger, F., Abalos, M., Bönisch, H., Castillo, A. E., von Clarmann, T., Diallo, M., Engel, A., Laube, J. C., Linz, M., Neu, J. L., Podglajen, A., Ray, E., Rivoire, L., Saunders, L. N., Stiller, G., Voet, F., Wagenhäuser, T., and Walker, K. A.: Age of Stratospheric Air: Progress on Processes, Observations, and Long-Term Trends, Rev. Geophys., 62, e2023RG000832, https://doi.org/10.1029/2023RG000832, e2023RG000832 2023RG000832, 2024b.
- Grooß, J.-U. and Russell III, J. M.: Technical note: A stratospheric climatology for O₃, H₂O, CH₄, NO_x, HCl and HF derived from HALOE measurements, Atmos. Chem. Phys., 5, 2797–2807, https://doi.org/10.5194/acp-5-2797-2005, 2005.
- Grooß, J.-U.: Modelling of stratospheric chemistry based on HALOE/UARS satellite data, PhD thesis, University of Mainz, Shaker Verlag Aachen, 142 pp., ISBN: 978-3-8265-1645-0, 1996.

- Haenel, F. J., Stiller, G. P., von Clarmann, T., Funke, B., Eckert, E., Glatthor, N., Grabowski, U., Kellmann, S., Kiefer, M., Linden, A., and Reddmann, T.: Reassessment of MIPAS age of air trends and variability, Atmos. Chem. Phys., 15, 13161–13176, https://doi.org/10.5194/acp-15-13161-2015, 2015.
- Hall, T. M. and Plumb, R. A.: Age as a diagnostic of stratospheric transport, J. Geophys. Res., 99, 1059–1070, 1994.
- Hauck, M., Bönisch, H., Hoor, P., Keber, T., Ploeger, F., Schuck, T. J., and Engel, A.: A convolution of observational and model data to estimate age of air spectra in the northern hemispheric lower stratosphere, Atmos. Chem. Phys., 20, 8763–8785, https://doi.org/10.5194/acp-20-8763-2020, 2020.
- Hegglin, M. I., Plummer, D. A., Shepherd, T. G., Scinocca, J. F., Anderson, J., Froidevaux, L., Funke, B., Hurst, D., Rozanov, A., Urban, J., von Clarmann, T., Walker, K. A., Wang, H. J., Tegtmeier, S., and Weigel, K.: Vertical structure of stratospheric water vapour trends derived from merged satellite data, Nat. Geosci., 7, 768–776, https://doi.org/10.1038/NGEO2236, 2014.
- Hersbach, H., Bell, B., Berrisford, P., Biavati, G., Horányi, A., Muñoz Sabater, J., Nicolas, J., Peubey, C., Radu, R., Rozum, I., Schepers, D., Simmons, A., Soci, C., Dee, D., and Thépaut, J.-N.: ERA5 hourly data on single levels from 1940 to present, Copernicus Climate Change Service (C3S) Climate Data Store (CDS) [data set], https://doi.org/10.24381/cds.adbb2d47, 2023.
- Holton, J. R., Haynes, P. H., McIntyre, M. E., Douglass, A. R., Rood, R. B., and Pfister, L.: Stratosphere-Troposphere Exchange, Rev. Geophys., 33, 403–439, 1995.
- Höpfner, M., Oelhaf, H., Wetzel, G., Friedl-Vallon, F., Kleinert, A., Lengel, A., Maucher, G., Nordmeyer, H., Glatthor, N., Stiller, G., Clarmann, T. v., Fischer, H., Kröger, C., and Deshler, T.: Evidence of scattering of tropospheric radiation by PSCs in mid-IR limb emission spectra: MIPAS-B observations and KOPRA simulations, Geophys. Res. Lett., 29, 119-1–119-4, https://doi.org/10.1029/2001GL014443, 2002.
- Hoppe, C. M., Hoffmann, L., Konopka, P., Grooß, J.-U., Ploeger, F., Günther, G., Jöckel, P., and Müller, R.: The implementation of the CLaMS Lagrangian transport core into the chemistry climate model EMAC 2.40.1: application on age of air and transport of long-lived trace species, Geosci. Model Dev., 7, 2639–2651, https://doi.org/10.5194/gmd-7-2639-2014, 2014.
- Johansson, S., Woiwode, W., Höpfner, M., Friedl-Vallon, F., Kleinert, A., Kretschmer, E., Latzko, T., Orphal, J., Preusse, P., Ungermann, J., Santee, M. L., Jurkat-Witschas, T., Marsing, A., Voigt, C., Giez, A., Krämer, M., Rolf, C., Zahn, A., Engel, A., Sinnhuber, B.-M., and Oelhaf, H.: Airborne limb-imaging measurements of temperature, HNO₃, O₃, ClONO₂, H₂O and CFC-12 during the Arctic winter 2015/2016: characterization, in situ validation and comparison to Aura/MLS, Atmos. Meas. Tech., 11, 4737–4756, https://doi.org/10.5194/amt-11-4737-2018, 2018.
- Kiefer, M.: Satellite-borne remote sensing of trace gases (SAT), MIPAS/ENVISAT data, V5R SF6 121/224/225, IMK/IAA [data set], https://www.imk-asf.kit.edu/english/308.php (last access: 28 February 2025), 2021.
- Konopka, P., Steinhorst, H.-M., Grooß, J.-U., Günther, G., Müller, R., Elkins, J. W., Jost, H.-J., Richard, E., Schmidt, U., Toon, G., and McKenna, D. S.: Mixing and Ozone Loss in the 1999–2000 Arctic Vortex: Simulations with the 3-dimensional Chemical Lagrangian Model of the Stratosphere (CLaMS), J. Geophys. Res., 109, D02315, https://doi.org/10.1029/2003JD003792, 2004.

- Konopka, P., Ploeger, F., and Müller, R.: Entropy-Based and Static Stability–Based Lagrangian Model Grids, chap. 10, 99–110 pp., American Geophysical Union (AGU), ISBN 9781118704578, https://doi.org/10.1029/2012GM001253, 2012.
- Konopka, P., Ploeger, F., Tao, M., Birner, T., and Riese, M.: Hemispheric asymmetries and seasonality of mean age of air in the lower stratosphere: Deep versus shallow branch of the Brewer-Dobson circulation, J. Geophys. Res., 120, 2053–2066, https://doi.org/10.1002/2014JD022429, 2015.
- Konopka, P., Tao, M., Ploeger, F., Diallo, M., and Riese, M.: Tropospheric mixing and parametrization of unresolved convective updrafts as implemented in the Chemical Lagrangian Model of the Stratosphere (CLaMS v2.0), Geosci. Model Dev., 12, 2441– 2462, https://doi.org/10.5194/gmd-12-2441-2019, 2019.
- Konopka, P., Tao, M., von Hobe, M., Hoffmann, L., Kloss, C., Ravegnani, F., Volk, C. M., Lauther, V., Zahn, A., Hoor, P., and Ploeger, F.: Tropospheric transport and unresolved convection: numerical experiments with CLaMS 2.0/MESSy, Geosci. Model Dev., 15, 7471–7487, https://doi.org/10.5194/gmd-15-7471-2022, 2022.
- Krause, J., Hoor, P., Engel, A., Plöger, F., Grooß, J.-U., Bönisch, H., Keber, T., Sinnhuber, B.-M., Woiwode, W., and Oelhaf, H.: Mixing and ageing in the polar lower stratosphere in winter 2015–2016, Atmos. Chem. Phys., 18, 6057–6073, https://doi.org/10.5194/acp-18-6057-2018, 2018.
- Lan, X., Tans, P., Thoning, K., and Laboratory, N. G. M.: NOAA Greenhouse Gas Marine Boundary Layer Reference – CH₄, NOAA GML [data set], https://doi.org/10.15138/TJPQ-0D69, 2023.
- Laube, J. C., Leedham Elvidge, E. C., Adcock, K. E., Baier, B., Brenninkmeijer, C. A. M., Chen, H., Droste, E. S., Grooß, J.-U., Heikkinen, P., Hind, A. J., Kivi, R., Lojko, A., Montzka, S. A., Oram, D. E., Randall, S., Röckmann, T., Sturges, W. T., Sweeney, C., Thomas, M., Tuffnell, E., and Ploeger, F.: Investigating stratospheric changes between 2009 and 2018 with halogenated trace gas data from aircraft, AirCores, and a global model focusing on CFC-11, Atmos. Chem. Phys., 20, 9771– 9782, https://doi.org/10.5194/acp-20-9771-2020, 2020.
- Leedham Elvidge, E. C., Bönisch, H., Brenninkmeijer, C. A. M., Engel, A., Fraser, P. J., Gallacher, E., Langenfelds, R., Mühle, J., Oram, D. E., Ray, E. A., Ridley, A. R., Röckmann, T., Sturges, W. T., Weiss, R. F., and Laube, J. C.: Evaluation of stratospheric age of air from CF₄, C₂F₆, C₃F₈, CHF₃, HFC-125, HFC-227ea and SF6; implications for the calculations of halocarbon lifetimes, fractional release factors and ozone depletion potentials, Atmos. Chem. Phys., 18, 3369–3385, https://doi.org/10.5194/acp-18-3369-2018, 2018.
- Linz, M., Plumb, R. A., Gerber, E. P., Haenel, F. J., Stiller, G., Kinnison, D. E., Ming, A., and Neu, J. L.: The strength of the meridional overturning circulation of the stratosphere, Nat. Geosci., 10, 663–667, 2017.
- McKenna, D. S., Grooß, J.-U., Günther, G., Konopka, P., Müller, R., Carver, G., and Sasano, Y.: A new Chemical Lagrangian Model of the Stratosphere (CLaMS) 2. Formulation of chemistry scheme and initialization, J. Geophys. Res., 107, ACH 4-1–ACH 4-14, https://doi.org/10.1029/2000JD000113, 2002a.
- McKenna, D. S., Konopka, P., Grooß, J.-U., Günther, G., Müller, R., Spang, R., Offermann, D., and Orsolini, Y.: A new Chemical Lagrangian Model of the Stratosphere (CLaMS) 1. Formulation

of advection and mixing, J. Geophys. Res., 107, ACH 15-1-ACH 15-15, https://doi.org/10.1029/2000JD000114, 2002b.

- MESSy Consortium: MESSy, GitLab [code], https://gitlab.dkrz.de/ MESSy/MESSy (last access: 4 March 2025), 2025.
- Montzka, S., McFarland, M., Andersen, S., Miller, B., Fahey, D., Hall, B., Hu, L., Siso, C., and Elkins, J.: Recent trends in global emissions of hydrochlorofluorocarbons and hydrofluorocarbons: Reflecting on the 2007 adjustments to the Montreal Protocol, The J. Phys. Chem. A, 119, 4439–4449, 2015.
- Nash, E. R., Newman, P. A., Rosenfield, J. E., and Schoeberl, M. R.: An objective determination of the polar vortex using Ertel's potential vorticity, J. Geophys. Res., 101, 9471–9478, 1996.
- Ploeger, F. and Birner, T.: Seasonal and inter-annual variability of lower stratospheric age of air spectra, Atmos. Chem. Phys., 16, 10195–10213, https://doi.org/10.5194/acp-16-10195-2016, 2016.
- Ploeger, F., Legras, B., Charlesworth, E., Yan, X., Diallo, M., Konopka, P., Birner, T., Tao, M., Engel, A., and Riese, M.: How robust are stratospheric age of air trends from different reanalyses?, Atmos. Chem. Phys., 19, 6085–6105, https://doi.org/10.5194/acp-19-6085-2019, 2019.
- Ploeger, F., Diallo, M., Charlesworth, E., Konopka, P., Legras, B., Laube, J. C., Grooß, J.-U., Günther, G., Engel, A., and Riese, M.: The stratospheric Brewer–Dobson circulation inferred from age of air in the ERA5 reanalysis, Atmos. Chem. Phys., 21, 8393– 8412, https://doi.org/10.5194/acp-21-8393-2021, 2021.
- Pommrich, R., Müller, R., Grooß, J.-U., Konopka, P., Ploeger, F., Vogel, B., Tao, M., Hoppe, C. M., Günther, G., Spelten, N., Hoffmann, L., Pumphrey, H.-C., Viciani, S., D'Amato, F., Volk, C. M., Hoor, P., Schlager, H., and Riese, M.: Tropical troposphere to stratosphere transport of carbon monoxide and long-lived trace species in the Chemical Lagrangian Model of the Stratosphere (CLaMS), Geosci. Model Dev., 7, 2895–2916, https://doi.org/10.5194/gmd-7-2895-2014, 2014.
- Ray, E. A., Moore, F. L., Rosenlof, K. H., Davis, S. M., Sweeney, C., Tans, P., Wang, T., Elkins, J. W., Bönisch, H., Engel, A., Sugawara, S., Nakazawa, T., and Aoki, S.: Improving stratospheric transport trend analysis based on SF6 and CO₂ measurements, J. Geophys. Res.-Atmos., 119, 14110–14128, https://doi.org/10.1002/2014JD021802, 2014.
- Ray, E. A., Moore, F. L., Garny, H., Hintsa, E. J., Hall, B. D., Dutton, G. S., Nance, D., Elkins, J. W., Wofsy, S. C., Pittman, J., Daube, B., Baier, B. C., Li, J., and Sweeney, C.: Age of air from in situ trace gas measurements: insights from a new technique, Atmos. Chem. Phys., 24, 12425–12445, https://doi.org/10.5194/acp-24-12425-2024, 2024.
- Riese, M., Oelhaf, H., Preusse, P., Blank, J., Ern, M., Friedl-Vallon, F., Fischer, H., Guggenmoser, T., Höpfner, M., Hoor, P., Kaufmann, M., Orphal, J., Plöger, F., Spang, R., Suminska-Ebersoldt, O., Ungermann, J., Vogel, B., and Woiwode, W.: Gimballed Limb Observer for Radiance Imaging of the Atmosphere (GLO-RIA) scientific objectives, Atmos. Meas. Tech., 7, 1915–1928, https://doi.org/10.5194/amt-7-1915-2014, 2014.
- Saunders, L. N., Walker, K. A., Stiller, G. P., von Clarmann, T., Haenel, F., Garny, H., Bönisch, H., Boone, C. D., Castillo, A. E., Engel, A., Laube, J. C., Linz, M., Ploeger, F., Plummer, D. A., Ray, E. A., and Sheese, P. E.: Age of air from ACE-FTS measurements of sulfur hexafluoride, EGUsphere [preprint], https://doi.org/10.5194/egusphere-2024-2117, 2024.

- Schoeberl, M. R., Douglass, A. R., Polansky, B., Boone, C., Walker, K. A., and Bernath, P.: Estimation of stratospheric age spectrum from chemical tracers, J. Geophys. Res.-Atmos., 110, D21303, https://doi.org/10.1029/2005JD006125, 2005.
- Schuck, T. J., Degen, J., Hintsa, E., Hoor, P., Jesswein, M., Keber, T., Kunkel, D., Moore, F., Obersteiner, F., Rigby, M., Wagenhäuser, T., Western, L. M., Zahn, A., and Engel, A.: The interhemispheric gradient of SF₆ in the upper troposphere, Atmos. Chem. Phys., 24, 689–705, https://doi.org/10.5194/acp-24-689-2024, 2024a.
- Schuck, T. J., Degen, J., Keber, T., Meixner, K., Wagenhäuser, T., Ghysels, M., Durry, G., Amarouche, N., Zanchetta, A., van Heuven, S., Chen, H., Laube, J. C., Baartman, S., van der Veen, C., Popa, M. E., and Engel, A.: Measurement report: Greenhouse gas profiles and age of air from the 2021 HEMERA-TWIN balloon launch, EGUsphere [preprint], https://doi.org/10.5194/egusphere-2024-3279, 2024b.
- Spang, R., Remedios, J. J., and Barkley, M. P.: Colour indices for the detection and differentiation of cloud type in infrared limb emission spectra, Adv. Space Res., 33, 1041–1047, https://doi.org/10.1016/S0273-1177(03)00585-4, 2004.
- Stiller, G.: MIPAS monthly zonal mean Age of Air data, based on MIPAS SF6 retrievals, processed at KIT-IMK, Karlsruhe, KI-Topen [data set], https://doi.org/10.5445/IR/1000139453, 2021.
- Stiller, G. P., von Clarmann, T., Funke, B., Glatthor, N., Hase, F., Höpfner, M., and Linden, A.: Sensitivity of trace gas abundances retrievals from infrared limb emission spectra to simplifying approximations in radiative transfer modelling, Appl. Optics, 41, 249–280, 2002.
- Stiller, G. P., von Clarmann, T., Höpfner, M., Glatthor, N., Grabowski, U., Kellmann, S., Kleinert, A., Linden, A., Milz, M., Reddmann, T., Steck, T., Fischer, H., Funke, B., López-Puertas, M., and Engel, A.: Global distribution of mean age of stratospheric air from MIPAS SF6 measurements, Atmos. Chem. Phys., 8, 677–695, https://doi.org/10.5194/acp-8-677-2008, 2008.

- Stiller, G. P., von Clarmann, T., Haenel, F., Funke, B., Glatthor, N., Grabowski, U., Kellmann, S., Kiefer, M., Linden, A., Lossow, S., and López-Puertas, M.: Observed temporal evolution of global mean age of stratospheric air for the 2002 to 2010 period, Atmos. Chem. Phys., 12, 3311–3331, https://doi.org/10.5194/acp-12-3311-2012, 2012.
- Virtanen, P., Gommers, R., Oliphant, T. E., Haberland, M., Reddy, T., Cournapeau, D., Burovski, E., Peterson, P., Weckesser, W., Bright, J., et al.: SciPy 1.0: fundamental algorithms for scientific computing in Python, Nat. Methods, 17, 261–272, 2020.
- Voet, F.: Lookup tables used in the publication "On the estimation of stratospheric age of air from correlations of multiple trace gases", in EGUsphere, Zenodo [data set], https://doi.org/10.5281/zenodo.14543944, 2024.
- Waugh, D. W.: The age of stratospheric air, Nat. Geosci., 2, 14–16, 2009.
- Waugh, D. W. and Hall, T. M.: Age of Stratospheric Air: Theory, Observations, and Models, Rev. Geophys., 40, 1-1–1-26, https://doi.org/10.1029/2000RG000101, 2002.
- WMO (World Meteorological Organization): Scientific Assessment of Ozone Depletion: 2022, Tech. Rep. Global Atmosphere Watch Programme (GAW) Report No. 278, 509 pp., World Meteorological Organization (WMO), Geneva, Switzerland, https://csl.noaa.gov/assessments/ozone/2022/downloads/2022OzoneAssessment.pdf (last access: 28 February 2025), 2022.
- WMO (World Meteorological Organization): Definition of the tropopause, WMO Bull., 6, 136 pp., 1957.