



UNIVERSITÉ
DE GENÈVE

FACULTÉ DES SCIENCES

Molecular atmospheric uncertainties and characterisation at CTAO

Yorgos Voutsinas for the
Calibration pipeline development team, and
CTAO systematics study team
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Introduction

Atmosphere is the medium with which γ -rays interact and Cherenkov light is produced and propagates

- **Atmospheric molecular density**

- Longitudinal shower development, height of first interaction, intensity of Cherenkov light

- **Refractive index profile**

- Cherenkov light production threshold, emission angle

- **Light transmission**

- Extinction = absorption + scattering

- Molecular extinction

- Rayleigh scattering + absorption (mainly O_3)

- Aerosol extinction

- Clouds, aerosols

Objective

Ongoing effort to estimate CTAO systematic uncertainties budget

- Atmosphere affects energy estimation, flux estimation, and source localization
- CTAO has set stringent requirements for systematic uncertainties, e.g. for energy estimation:

$$\left(\frac{\delta E_{\text{scale}}(E)}{E} = 10\%\right) \sim \left(\frac{\delta E_{\text{atmosphere}}(E)}{E} = 8\%\right) \oplus \left(\frac{\delta E_{\text{telescopic part}}(E)}{E} = 5\%\right) \oplus \left(\frac{\delta E_{\text{analysis}}(E)}{E} = 4\%\right)$$

- Significant improvement wrt current IACTs ($\sim 15\%$ under optimal conditions)

Objective: understand and reduce systematic uncertainties related to the molecular atmosphere

- Atmospheric monitoring & characterisation
 - Molecular atmosphere calibration suite

Shower development & Cherenkov light creation

Observations from past studies* have shown

- Cherenkov light density on the ground can vary up to 60% for atmospheric models of different geographical latitudes.
- Seasonal variations of mid-latitude models show differences in the range of 5-15%.

These variations highlight the need for detailed molecular atmosphere characterization

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K. Bernlöhner *Astroparticle Physics* 12 (2000) 255–268

P. Munar-Adrover and M. Gaug, *European Physical Journal Web of Conferences*. Vol. 197. *European Physical Journal Web of Conferences*. Sept. 2019, p. 01002

M. K. Daniel. “Application of radiosonde data to VERITAS simulations”

Molecular atmosphere characterisation pipeline

First implementation of the molecular atmosphere characterisation suite

- It calculates the astronomical dusk and dawn → timeseries to be requested
- It requests & retrieves the timeseries of meteorological data from Data assimilation Systems (DAS)
- Analyses the meteorological data & produces a profile describing the atmosphere state for the given night

2 modes of operation

The Calibration Pipeline can produce a contemporary model describing the atmosphere over the observatory for any given night that contains all the required information in order to launch Corsika simulation

- **Production of tailored IRFs for a given observation**

The Calibration Pipeline can select a seasonal model best matching the conditions over the observatory for a given night

- The selection is based on the molecular number density at an altitude of 15km a.s.l.
- **Selection of the best matching set of pre-calculated IRFs**

Molecular atmosphere calibration input data

DAS reanalysis / analysis datasets

- DAS provide datasets over a grid covering Earth, at various pressure levels for each grid point. Datasets are updated every (few) hours
- Dataset become publicly available with some latency

GDAS ds083.2, available from Research Data Archive

- Few hours latency, 120km x 120km grid, update every 6 hours, ceiling ~ 26 km a.s.l. rather unstable interface

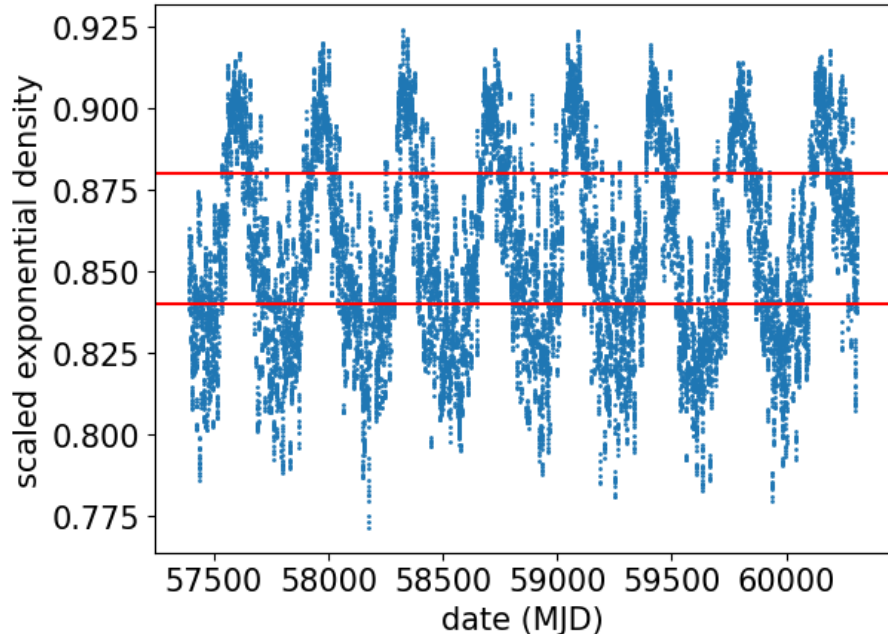
ECMWF ERA-5, available from Copernicus (EU program)

- 5 days latency, 31km x 31km grid, update every hour, ceiling ~45km a.s.l., stable interface



Available grid from Copernicus

Seasonal profiles uncertainties



Variations of molecular density at 15km a.s.l. during 8 years in La Palma. The data comes from the analysis of ERA5 dataset of ECMWF, available through Copernicus. We can see 3 seasons.

An uncertainty of ~5% has been estimated for the North in previous studies if no molecular atmosphere calibration is applied.

- It can be reduced to ~3% with the use of seasonal models.

Ongoing studies

- Season definition & uncertainty budget estimation for the South site
- Refinement of the uncertainty budget for the North site using latest years data retrieved from the more precise ERA-5 dataset

Tailored profiles uncertainties

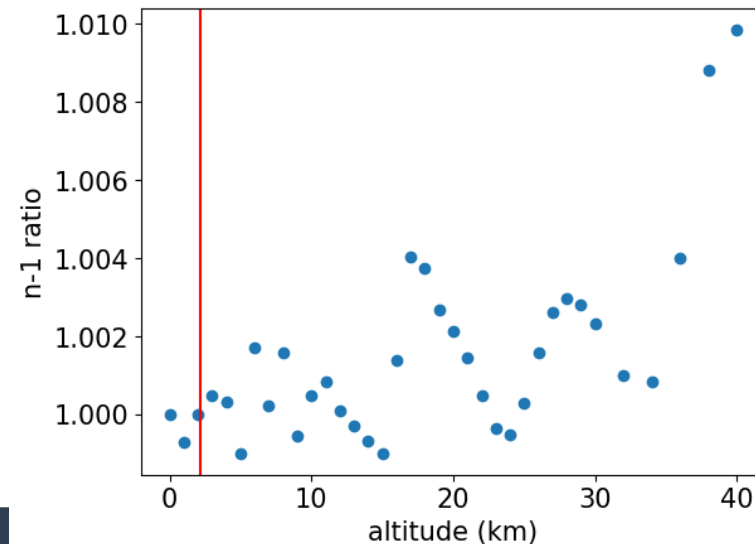
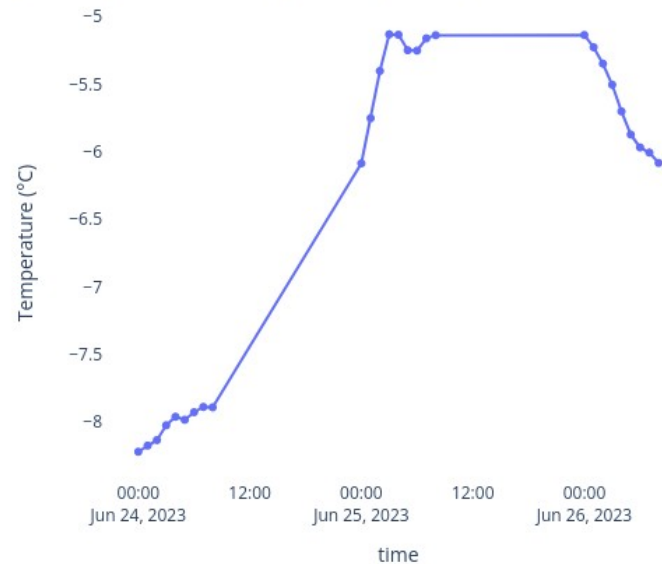
Tailored profiles should provide smaller uncertainties than seasonal ones, but:

- How can we estimate the uncertainties of the data assimilation systems?
 - According to their documentation, uncertainties either are not publicly available (GDAS-RDA) or shouldn't be taken at face value (ECMWF)

An estimation of the systematics introduced by nightly profiles can be made by looking at the hourly variation

- It includes both DAS uncertainty + diurnal variations
 - Both constitute systematic error for nightly profiles

night temperature hourly June 23, @500hPa, Paranal



Data assimilation systems validation

Data assimilation systems provide the atmospheric parameters on grid points over the globe

- › Can we be sure that propagating the atmospheric state to the observatory site does not introduce biases?
 - › Will be translated into IRF biases
- › Especially when the measurement sites are far from the observatory sites
 - › South site: the closest radiosonde station is at the sea coast

Ground validation with the weather station

Even better, validation with a radiosonde campaign performed on site

Cherenkov light transmission: extinction mechanisms

Light extinction in atmosphere

Slow component: Molecular extinction

Rayleigh scattering

- › Produced by Calibration pipeline via the analysis of DAS data

Molecular absorption

- › Mainly ozone
- › If calibration needed
 - › DAS data
- › If not
 - › Average profiles created with some radiative transfer code

Fast component: aerosols/clouds

Rapidly varying (timescale of minutes)

Will be tackled using input of LIDAR & FRAM and historical climatological data

Cherenkov light transmission calibration

The Calibration pipeline will continuously monitoring the extinction processes

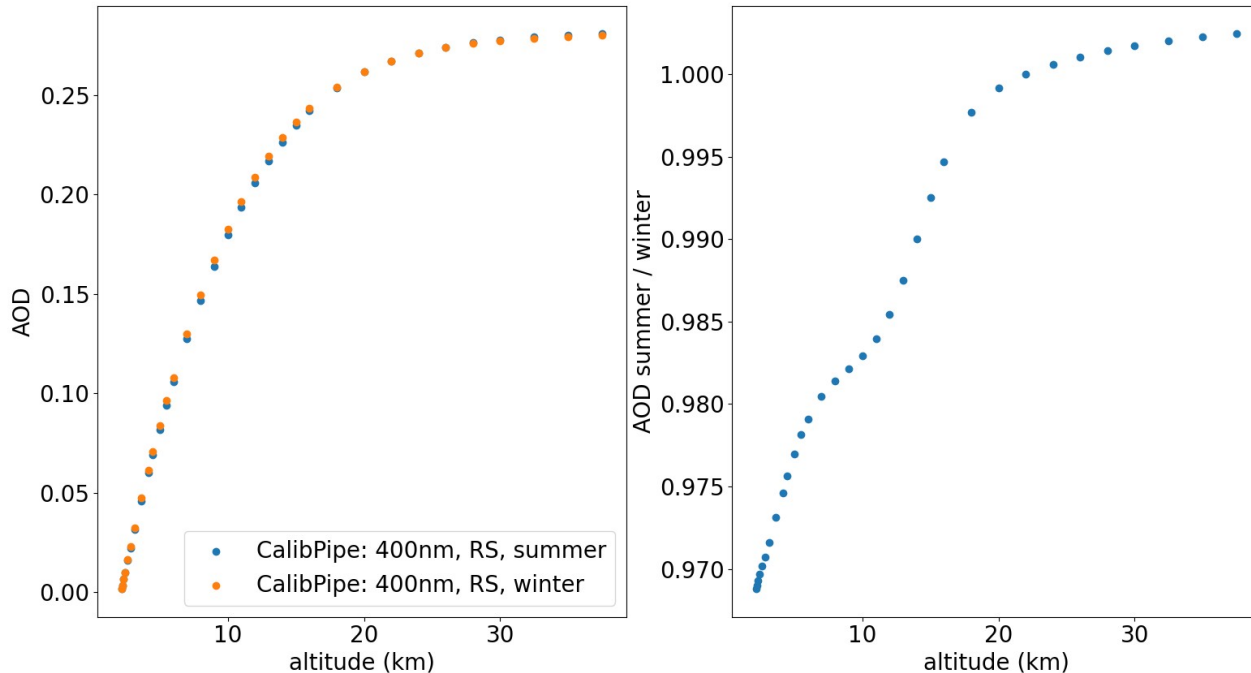
- Aerosols and clouds will be monitored via observatory elements (LIDARs & FRAMs)
- Molecular extinction via DAS (ECMWF & GDAS)?

The final calibration product will be an extinction hypercube

- Represents optical depth evolution as a function of time, wavelength, altitude, and pointing
- The fast component of the extinction hypercube will be updated during an observation block

Here we focus on the molecular extinction

Rayleigh scattering



The dominant light extinction process in a clear night

- Preliminary studies of a first version of seasonal profiles for La Palma
- The difference in the Cherenkov light density reaching the ground is within 1 %
- Simulation studies using more elaborate seasonal profiles have been planned

Ozone study: motivations

Will the use of an average ozone profile, produced with a radiative transfer code, satisfy CTAO requirements?

- There are several processes (seasonal variation, stratosphere to troposphere transport, horizontal transport of anthropogenic ozone)

Scope of the study

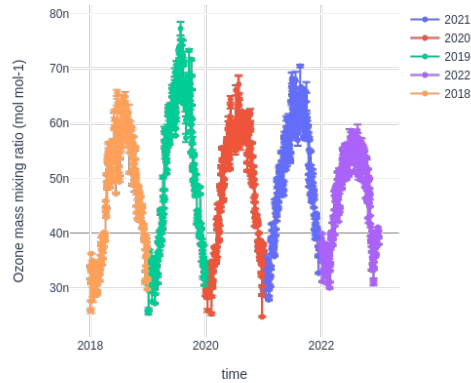
- 1) See if we indeed need ozone monitoring & calibration
- 2) If yes, with what frequency (daily, seasonal)
- 3) Produce software tools & workflows towards that end

But first let's see the variations of ozone mixing ratio at various pressure levels

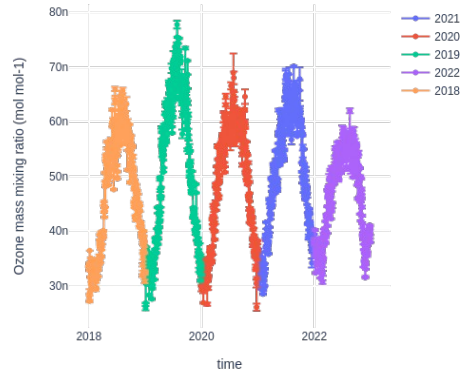
- ECMWF ERA-5 dataset, available through Copernicus, 5 years (2018-2022), over the South site
- First analysis performed at the Climate Data Store (CDS) servers, using **Toolbox**

Ozone mixing ratios per pressure level (South)

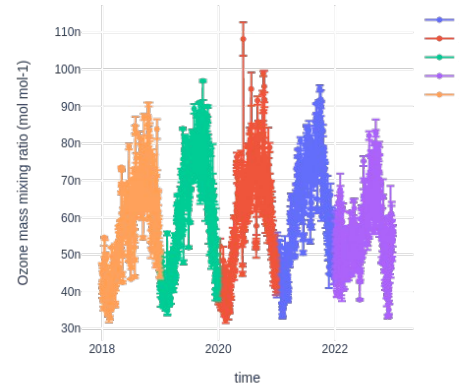
Nightly mean & std of ozone MR in Atacama @ 1000hPa



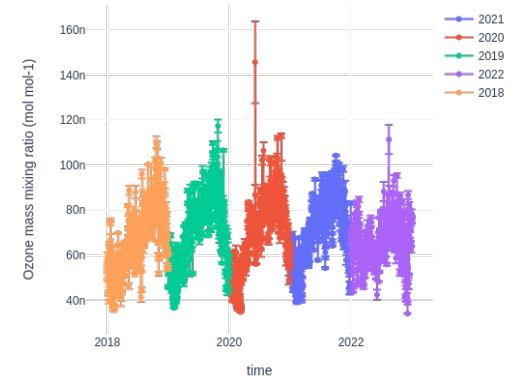
Nightly mean & std of ozone MR in Atacama @ 900hPa



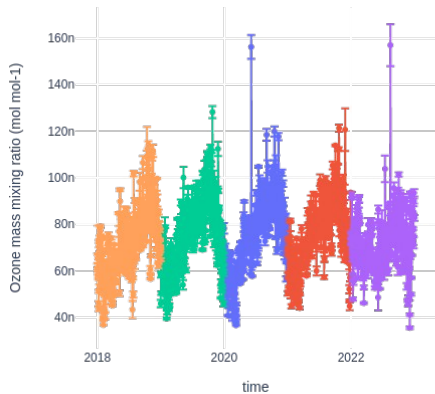
Nightly mean & std of ozone MR in Atacama @ 800hPa



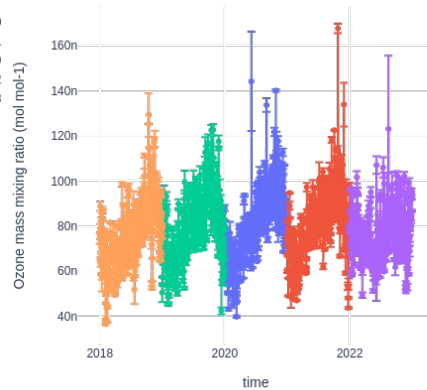
Nightly mean & std of ozone MR in Atacama @ 700hPa



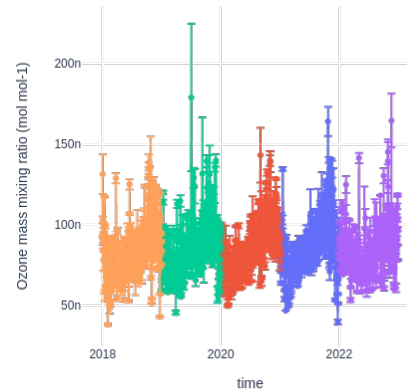
Nightly mean & std of ozone MR in Atacama @ 650hPa



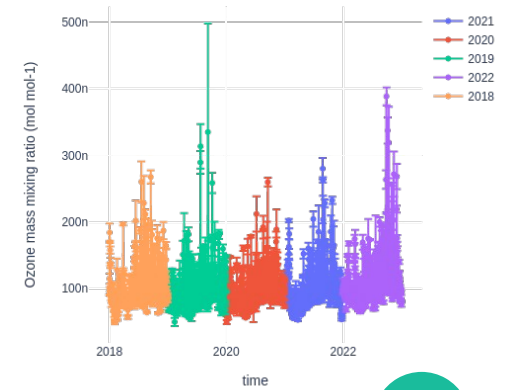
Nightly mean & std of ozone MR in Atacama @ 600hPa



Nightly mean & std of ozone MR in Atacama @ 500hPa

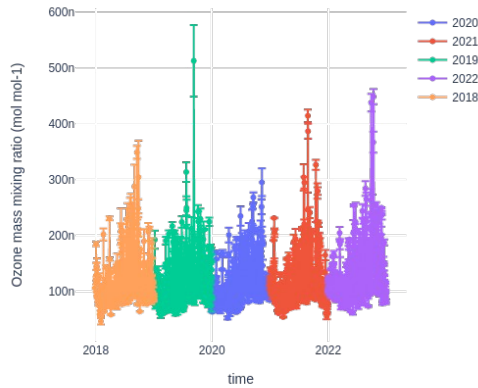


Nightly mean & std of ozone MR in Atacama @ 250hPa

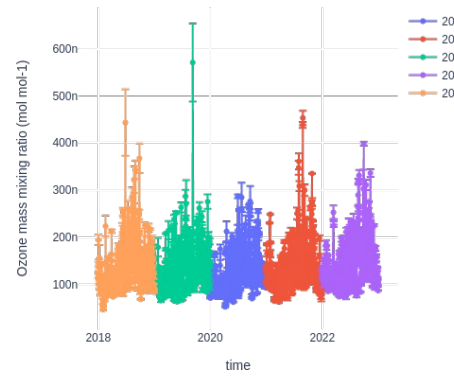


Ozone mixing ratios per pressure level (South)

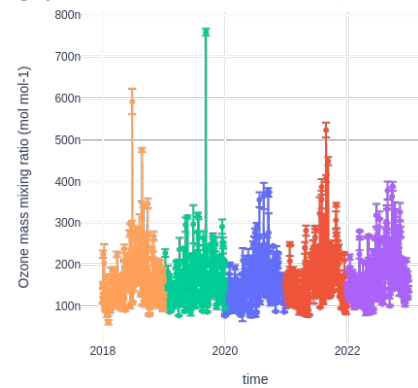
Nightly mean & std of ozone MR in Atacama @200hPa



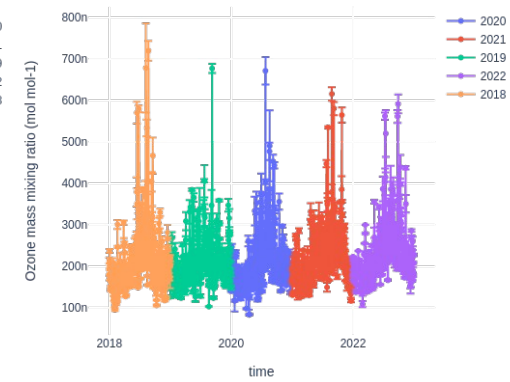
Nightly mean & std of ozone MR in Atacama @175hPa



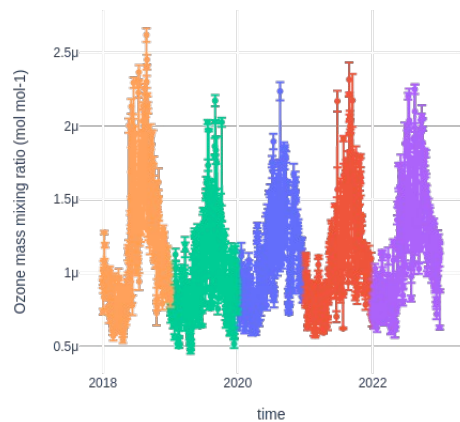
Nightly mean & std of ozone MR in Atacama @150hPa



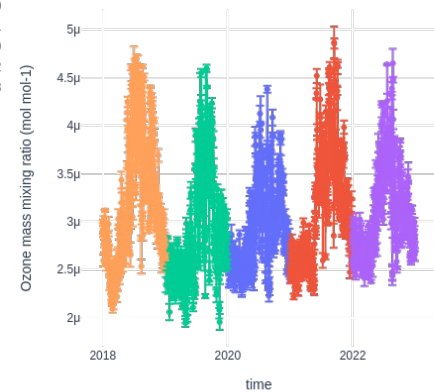
Nightly mean & std of ozone MR in Atacama @ 125hPa



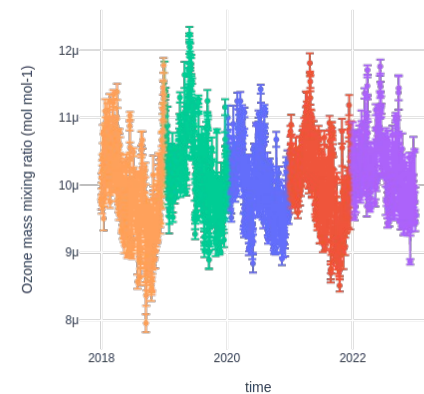
Nightly mean & std of ozone MR in Atacama @ 70hPa



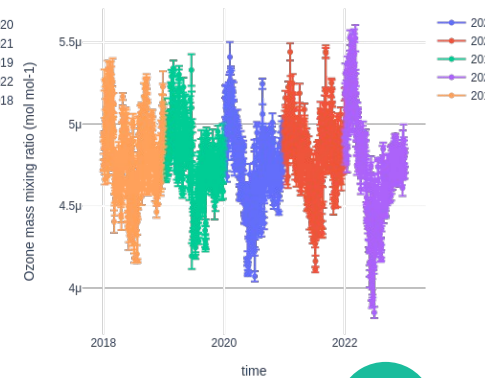
Nightly mean & std of ozone MR in Atacama @ 50hPa



Nightly mean & std of ozone MR in Atacama @ 3hPa



Nightly mean & std of ozone MR in Atacama @ 1hPa



Production of ozone absorption profile

Ozone absorption per wavelength per height bin, in a format compatible with the CTAO simulation tools (`sim_telarray`)

1) `ozone_MR` (mol/mol) * `atmospheric_density` (g/cm³) * `N_A` (particle x mol⁻¹) / `MolarMassOzone` (kg.mol) → **ozone number density** (particle/m³)

2) $a(H, \lambda) = \text{ozone number density (particle/m}^3) * \text{Cross section (m}^2/\text{particle)}$

The cross section was retrieved from V. Gorshelev et al, AMT, 7, 609-624, 2014

3) **Integrate $a(\lambda)$** for various altitudes in order to obtain optical depth (OD)

We have all we need to run simulations in order to estimate the effect of ozone

- As a first approximation we will use the `testeff` program, provided as a part of the `sim_telarray` package

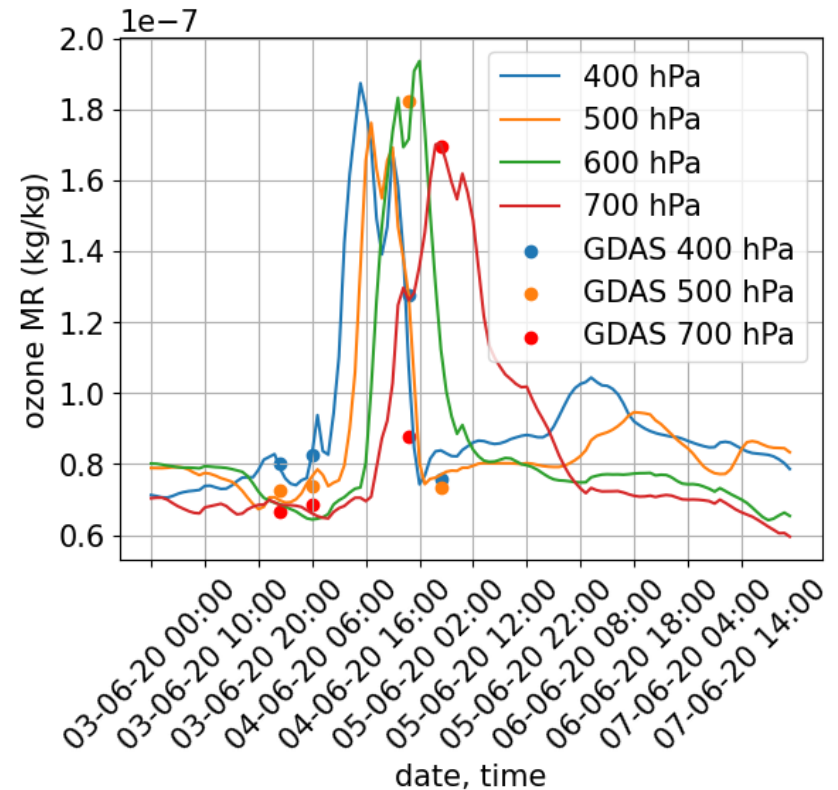
Extreme events

Transport of ozone masses from the Stratosphere to the Troposphere (STT)

- STT example happened 4th - 5th of June 2020, over the South site
- ~ 2 days duration, ozone seems to reside few hours to each pressure level
- Recorded both by GDAS & ECMWF

On going studies

- Effect of STT events on the light density on the ground & the IRFs
- How frequently such events are occurring?
- Correlations with other phenomena?



Seasonal variations and extreme events

Example: preliminary results, only ozone extinction, comparison between a day in June and a day in May

- › Differences within 1-2% have been observed
- › A conclusive study on the need for ozone calibration requires the comparison in (energy bias, effective area) between an average ozone profile and various extreme (but natural) ozone profiles
- › Decide whether to disentangle (or not) from Rayleigh Scattering and average aerosol extinction profiles for each site

λ range	Zd	Emission alt	Optical efficiency (05/25/2020 / 05/06/2020)
nm	deg	Km (a.s.l.)	%
290 – 750	0	12.585	98.3

Nitrogen oxides

NO_x molecules also absorb in the spectrum range of interest

We focus on NO₂

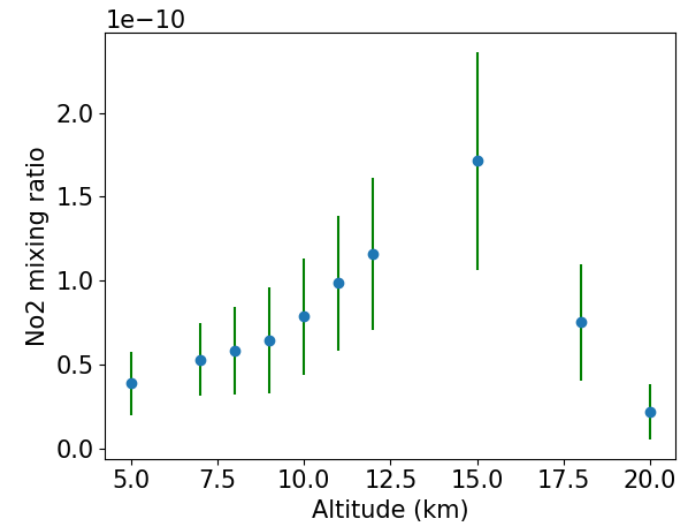
- Larger mixing ratio wrt NO
- Absorption cross section available in HITRAN

Analysis of 4 months of data over La Palma (Sep-Dec 2023)

- Copernicus Atmospheric Monitoring Service (CAM5) global reanalysis (EAC4)

Motivations for the study

- Time variability of NO₂ mixing ratio
 - Lightnings, pollution from aircrafts
- Light density on the ground, with/without NO₂ absorption
 - Definition of calibration strategy



λ range	Zd	Emission altitude (a.s.l.)	Optical efficiency (with NO ₂ / without)
290 – 750 (nm)	0 deg	9.851 km	99.99 %
290 – 750 (nm)	0 deg	12.585 km	99.98 %

Conclusion

The first version of the molecular atmosphere calibration has been developed

Calibration software that assess the effect of absorbing molecules has been developed

- Preliminary results of their impact and their variations are presented here

Next Steps

- **Shower development & light creation**

- 1) Revisit uncertainty budget estimation for the CTAO north site using ERA-5 datasets; studies for the south site are in planning.
- 2) Validation of DAS datasets with dedicated radiosonde campaigns & surface data from weather stations
- 3) Discuss an approach to estimate the systematic uncertainty budget for tailored simulations

- **Molecular extinction**

- 1) Include temperature dependence of absorption cross sections.
- 2) Conduct simulations to refine systematic uncertainty budget and define a detailed calibration strategy.