



Development of a real-time tool for deriving the optical properties of aerosol particles in PANGEA observatory, using ground-based passive remote sensing measurements

Thesis Supervisor

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Master thesis 18 September 2020, Athens





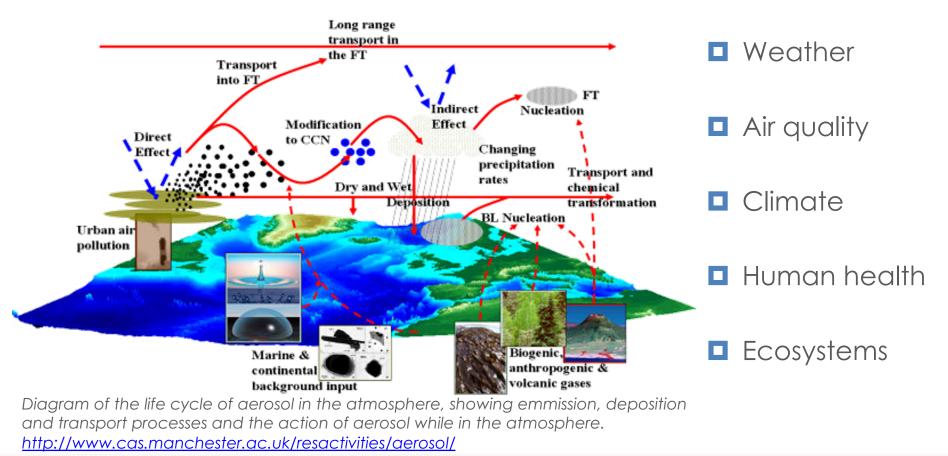
- Thesis Scope
- Aerosol research
- PANhellenic GEophysical observatory of Antikythera (PANGEA)
- AErosol RObotic NETwork (AERONET)
- Developed tool and implementation
- Results
- Future work
- Summary





Aerosols can affect Earth's energy budget, by directly scattering, absorbing and emitting the incoming solar radiation, and by indirectly influencing the cloud properties.

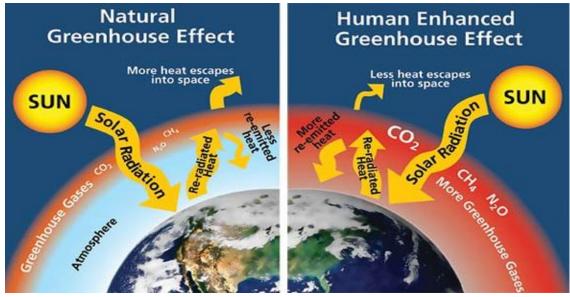
The atmospheric aerosols play an important role to:







- This work calculates the optical properties of aerosol particles.
- The **importance** of aerosol optical properties for climate studies.
- a) Because aerosol impact the Earth-atmosphere budget
- b) Their chemical reaction affect the weather and can harm human health





Tool description



Tool description: Development of a tool for deriving the optical properties of aerosol particles in PANGEA observatory at near-real-time, using ground-based passive remote sensing measurements.

Development steps:

- Create a tool that automatically downloads the sun-photometer measurements from the Antikythera AERONET station (at PANGEA), in near real-time.
- **Display** them in graphical plots.
- Use the Mie scattering code to calculate the particle optical properties: the extinction, absorption, scattering and backscatter coefficients.

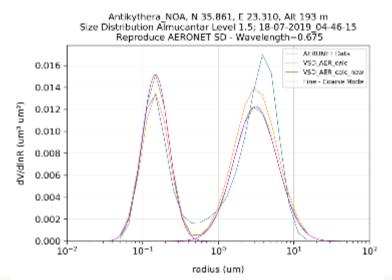


Create a new **tool** that:

■ Automatically downloads the AERONET sun-photometer products (size and refractive index of aerosol particles) derived from measurements at PANGEA.

Display them in graphical plots in near real-time.

Calculate the optical properties of the particles, when they have spherical shapes.



ext_all=8.326684453680716e-05 sca_all=7.411795168585089e-05 abs_all=9.14889285095627e-06 bac_all=1.7400255234561573e-06 ext_f=7.183912358268646e-05 sca_f=6.622154404926358e-05 abs_f=5.617579533422876e-06 bac_f=1.4251190852857044e-06 ext_c=1.1427720954120696e-05 sca_c=7.896407636587302e-06 abs_c=3.531313317533394e-06 bac_c=3.1490643817045284e-07





It is a near real-time tool

The tool can calculate in <u>few seconds</u> the optical properties of aerosols after the data are published in the AERONET



PANhellenic GEophysical observatory of Antikythera



PANGEA



PANGEA observatory in Antikythera island has been installed by the **National Observatory of Athens** (NOA) in order to respond to the scientific need for accurate climatic observations in the Mediterranean.

Why Antikythera ?

- crossroad of Europe, Africa and Asia
- anthropogenic activities are very few, due to its population
- ideal place for monitoring natural aerosols
- transported anthropogenic aerosols from big cities in Greece and the surrounding Mediterranean countries



Antikythera NOA equipment (from National Documentation Centre, www.ekt.gr)

- Available instruments in PANGEA:

 PolyXT lidar (EARLINET)
 - **CIMEL sun-photometer** (AERONET)



CIMEL Sun-Photometer



What does CIMEL Sun-Photometer do?

Provides:

- AOD from direct-sun measurements
- Microphysical properties of the aerosol particles from diffused light measurements

How does CIMEL Sun-Photometer acquire measurements?

- Every day between sunlight and dawn
- In nine spectral bands:
 - 340, 380, 440, 500, 670, 870, 940, 1020 and 1640 nm.

It's a **passive remote sensing** instrument



CIMEL sun-photometer (from https://aeronet.gsfc.nasa.gov)

The CIMEL sun-photometer products provide us with the microphysical properties the developed tool uses for the calculation of the aerosol optical properties.

AErosol RObotic NETwork





What is the AERONET?

It is a network of ground-based sun photometers



The worldwide spatial distribution of the AERONET stations

It provides observations of the optical and microphysical properties of the atmospheric aerosols

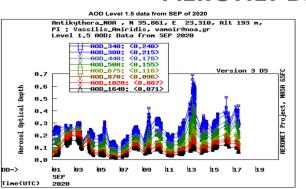
How the AERONET data products can be accessed ?

- Through the AERONET web download tool in AERONET site <u>https://aeronet.gsfc.nasa.gov/</u>
- Through the AERONET web services

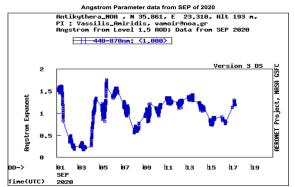
AERONET...Aerosol products



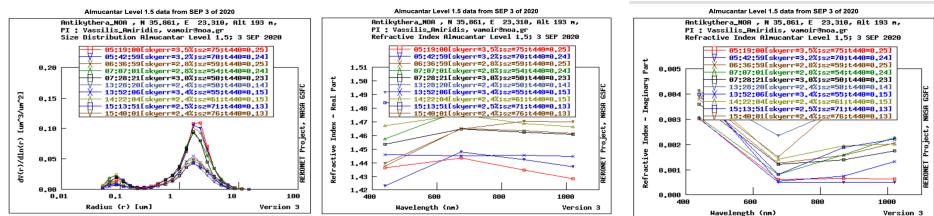
AERONET data display uses a **user-friendly interface** that includes **graphical representations** to display the optical and microphysical properties of the aerosol particles.



AERONET DATA PRODUCTS



AERONET INVERSION DATA PRODUCTS



Developed tool and implementation

What is our aim?

- To calculate the optical properties of spherical aerosol particles in PANGEA observatory based on the AERONET measurements
 - The **scattering** coefficient \bigcirc
 - The **backscatter** coefficient \bigcirc
 - The **absorption** coefficient
 - The extinction coefficient



for fine (diameter $<2.5 \,\mu\text{m}$) and coarse (diameter $>2.5 \,\mu\text{m}$) mode.





words



- What data are used from Antikythera_NOA AERONET station?
 - The microphysical properties of the aerosols
 - The **volume size distribution** (dv/dlnr)
 - The complex refractive index
 - The sphericity percentage
- **How often the station gives data**?

if there are clouds





- What data are used from Antikythera_NOA AERONET station?
 - The microphysical properties of the aerosols
 - o The volume size distribution (dv/dlnr)
 - o The refractive index
 - o The sphericity percentage
- How often the station gives data?

Otherwise	UTC /Local time	UTC /Local time	After how many minutes we can
Omerwise	~ 5:00/8:00	~ 13: 34/16:34	access the data?
	~ 5:25/8:25	~ 14:28/17:28	~25'
	~ 6:13/9:13	~ 14:58/17:58	Loading
	~ 6:43/9:43	~ 15:49/18:49	
	~ 7:34/10:34	~ 16:13/19:13	
	~ 8:25/11:25	No data	
	~ 12:25/15:25	Until next day	

Software implementation tools



Programming language: Python version 3.7



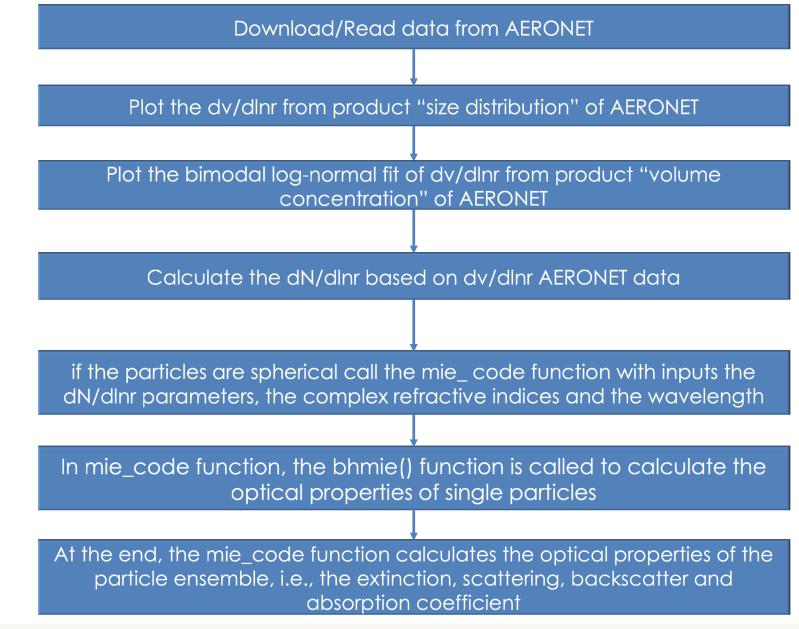
- o Open Source
- Object Oriented
- Big Supported Community
- Easy to learn

Scientific Python development environment: Spyder with Anaconda





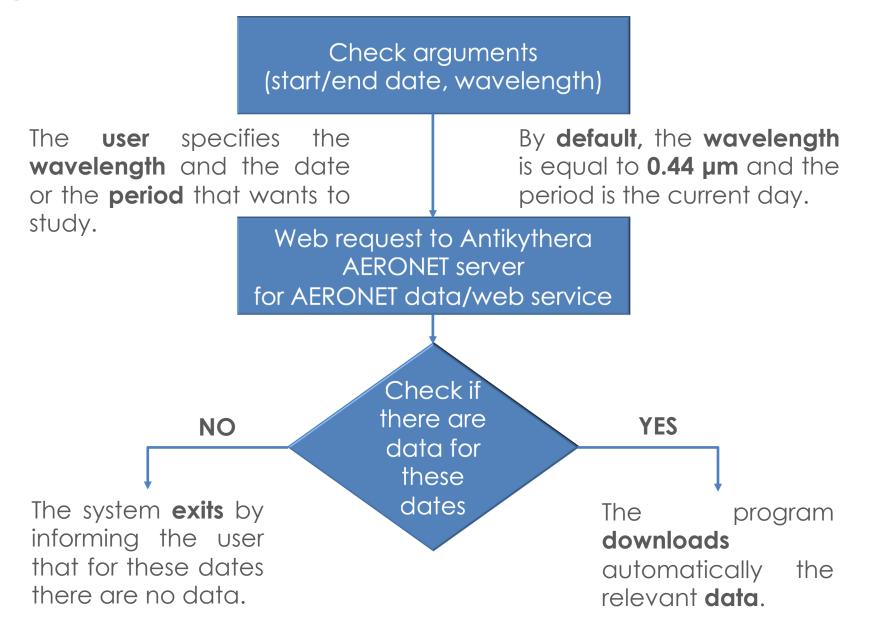




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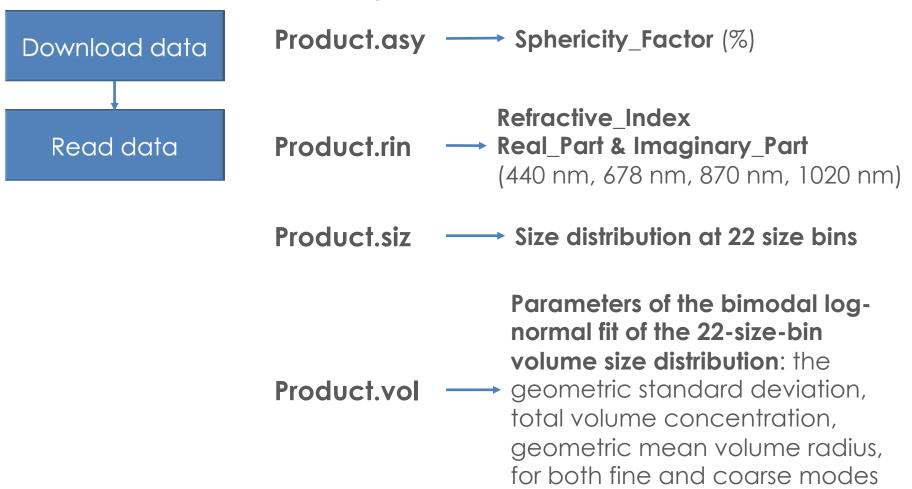




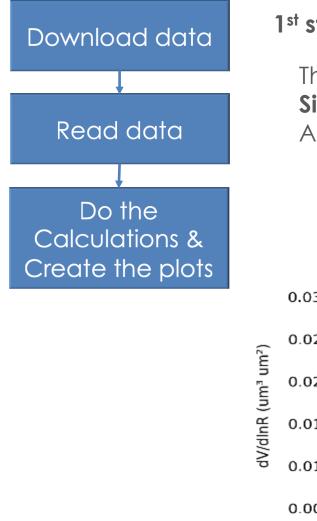


In the case that there are data, there is an iteration, because there can be more than one measurements (at different times) in the day.

AERONET product Parameters

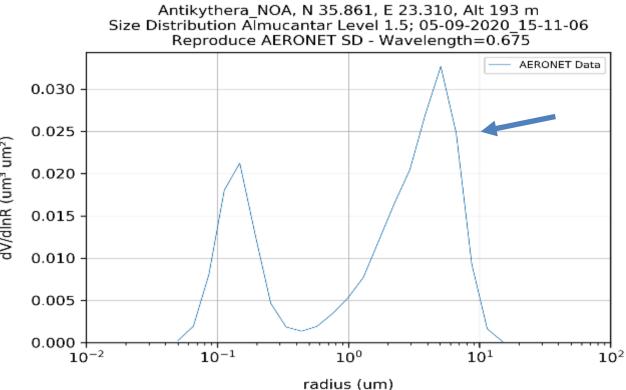




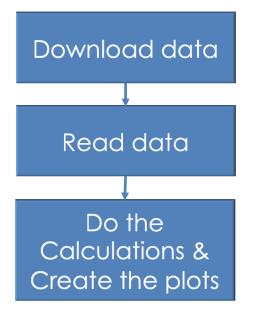


1st step

The blue line represents the 22-size-bin Volume **Distribution** (dv/dlnr) acquired from Size the AERONET product (product.siz).







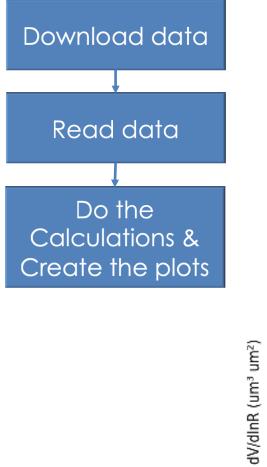
2nd step

Based on **the (six) parameters** of the bimodal lognormal fit of the 22-size-bin volume size distribution, we calculate the dv/dlnr_fit:

$$\frac{dV}{d\ln r} = \frac{volc_f}{\sqrt{2\pi}\ln(std_f)} exp\left(-\frac{(\ln(r) - \ln(vmr_f))^2}{2\ln(std_f)^2}\right) + \frac{volc_c}{\sqrt{2\pi}\ln(std_c)} exp\left(-\frac{(\ln(r) - \ln(vmr_c))^2}{2\ln(std_c)^2}\right)$$

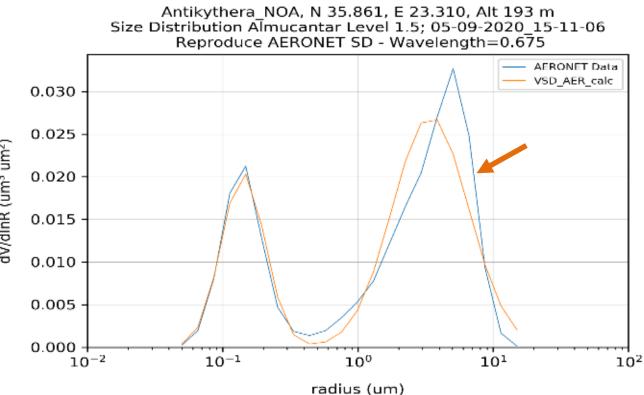
where $\frac{dv}{dlnr}$: the particle volume size distribution $volc_f$: the total volume concentration of fine mode $volc_c$: the total volume concentration of coarse mode vmr_f : volume geometric mean radius of fine mode vmr_c : volume geometric mean radius of coarse mode std_f : geometric standard deviation of fine mode std_c : geometric standard deviation of coarse mode





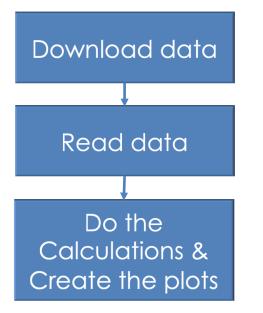
2nd step

The orange line is the bimodal log-normal fit of the 22-size-bin Volume Size Distribution (dv/dlnr_fit). It fits the blue line using only six parameters (volc_f, volc_c, vmr_f, vmr_c, std_f, std_c).



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2nd step

Why we need this step?

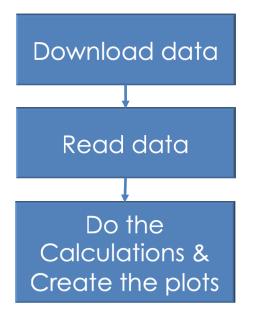
Because the Mie scattering code has as input a bimodal lognormal size distribution.

This size distribution is described based on these six parameters.

Parameters

- Total volume concentration (volc_f, volc_c)
- Volume geometric mean radius (vmr_f, vmr_c)
- Geometric standard deviation (std_f, std_c)





2nd step

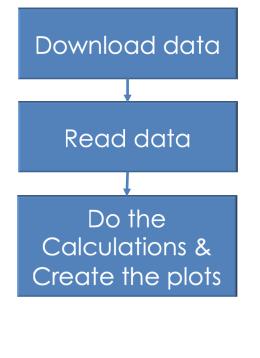
More specifically

The input of the Mie scattering code is a bimodal lognormal number size distribution.

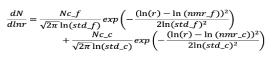
And how can I calculate it?

$$\frac{dN}{d\ln r} = \frac{Nc_{f}}{\sqrt{2\pi}\ln(std_{f})} exp\left(-\frac{(\ln(r) - \ln(nmr_{f}))^{2}}{2\ln(std_{f})^{2}}\right) + \frac{Nc_{c}c}{\sqrt{2\pi}\ln(std_{c}c)} exp\left(-\frac{(\ln(r) - \ln(nmr_{c}c))^{2}}{2\ln(std_{c}c)^{2}}\right)$$





2nd step



In order to calculate the six parameters of the number size distribution (Nc_f, Nc_c, nmr_f, nmr_c, std_f, std_c) based on the six parameters of the volume size distribution (volc_f, volc_c, vmr_f, vmr_c, std_f, std_c) we use these formulas:

where

Nc_f: the total number concentration of fine mode

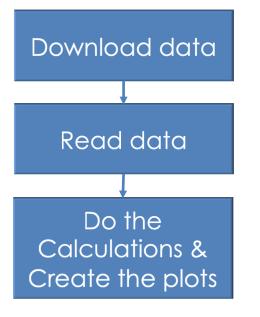
Nc_c: the total number concentration of coarse mod

$$\begin{split} & Nc_f = \sum \left(radius_AER_dif \cdot \\ & \left(\frac{1}{radius_AER_mean} \frac{volc_f}{\sqrt{2\pi}std_f} \frac{\exp\left(-\frac{\left(\left(\ln(radius_AER_mean) - \ln(vmr_f)\right)^2\right)}{2std_f^2}\right)}{\frac{4\pi}{3}radius_AER_mean^3} \right) \right) \end{split}$$

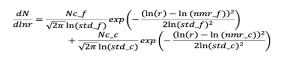
$$Nc_c = \sum \left(radius_AER_dif \cdot \right)$$

 $\left(\frac{1}{radius_AER_mean}\frac{volc_c}{\sqrt{2\pi}std_c}\frac{\exp\left(-\frac{\left((\ln(radius_AER_mean)-\ln(vmr_c)\right)^2\right)}{2std_c^2}\right)}{\frac{4\pi}{3}radius_AER_mean^3}\right)$





2nd step



In order to calculate the six parameters of the number size distribution (Nc_f, Nc_c, nmr_f, nmr_c, std_f, std_c) based on the six parameters of the volume size distribution (volc_f, volc_c, vmr_f, vmr_c, std_f, std_c) we use these formulas:

$$nmr_f = \frac{\exp\left(\ln(2 - \nu mr_f) - 3std_f^2\right)}{2}$$

where

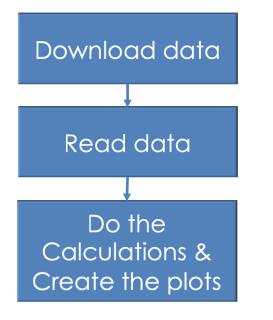
nmr_f, nmr_c:

the number mean radius for fine and coarse mode

$$nmr_c = \frac{\exp\left(\ln(2 - vmr_c) - 3std_c^2\right)}{2}$$

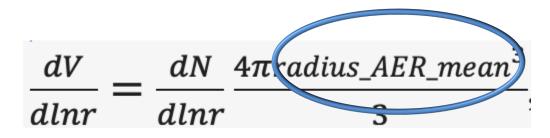
The **geometric standard deviation** ("std_f" and "std_c") **does not change** for number and volume size distributions.





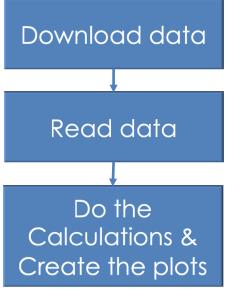
2nd step

After calculating dN/dlnr with the formulas presented in the previous slides, we calculate the volume size distribution using the following formula:



This formula uses the assumption **that the size does** not change within the size bin and is equal to the mean radius of the size bin (radius_AER_mean).

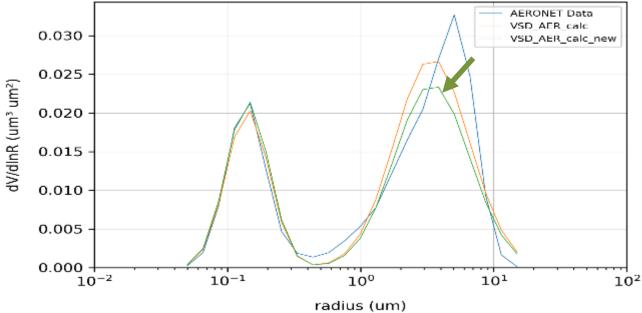




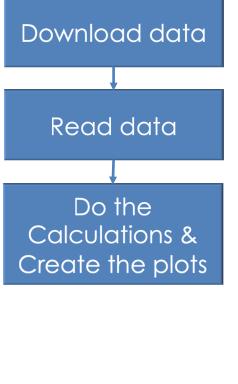
3^{ed} step

The green line, is the reproduction of the bimodal volume size distribution, using the calculated number size distribution. This line is used to verify our calculations $\frac{dN}{dlnr'}$, since in the ideal case it should coincide with the orange line (i.e. the bimodal log-normal fit of the 22-size-bin volume size distribution).

Antikythera_NOA, N 35.861, E 23.310, Alt 193 m Size Distribution Almucantar Level 1.5; 05-09-2020_15-11-06 Reproduce AERONET SD - Wavelength=0.675

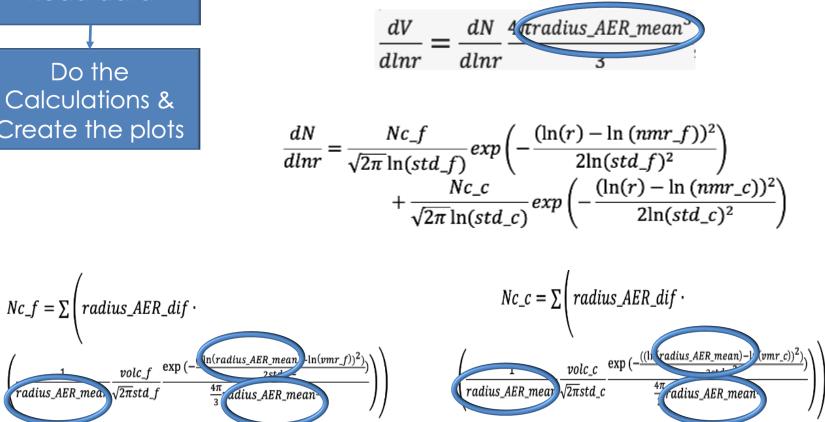




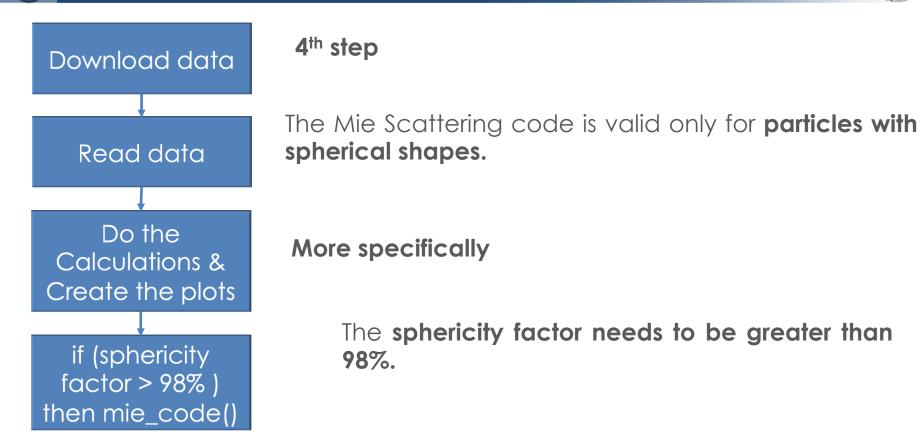


3^{ed} step

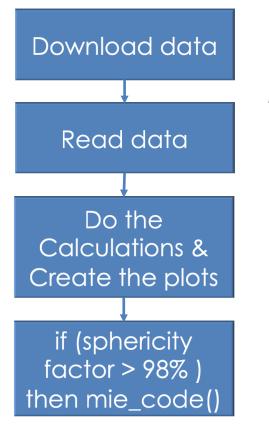
This does not happen all the times, mainly due to the limitation in equation to use a representative value for the radius of the size bin.











4th step

Mie scattering code

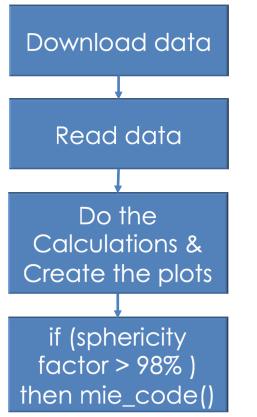
Inputs

□ The user-defined wavelength

- The parameters of the number size distribution (Nc_f, Nc_c, nmr_f, nmr_c, std_f and std_c)
- The real and imaginary part of the refractive index (considered to be the same for fine and coarse particles)

4th step



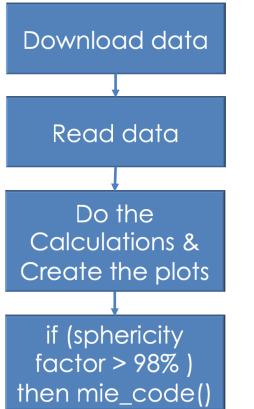


The mie_code() function **calculates**:

• The **number concentration in each sub-bin** for fine and coarse mode respectively based on the following formula:

$$dcon_c = Nc_c \exp\left(-1\left(ln\frac{r}{nmr_c}\right)^2/(2\,std_c^2)\right)\frac{1}{r\,std_c\,\sqrt{2\pi}}$$





4th step

$$dcon_c = Nc_c \exp\left(-1\left(ln\frac{r}{nmr_c}\right)^2/(2\,std_c^2)\right)\frac{1}{r\,std_c\,\sqrt{2\pi}}$$

The mie_code() function **calculates**:

• The **volume size distribution** (*SD_dv_dlnr*) for fine and coarse mode based on the following formula:

$$SD_dv_dlnr = r\left(\frac{4\pi}{3}\right)r^3dcon$$

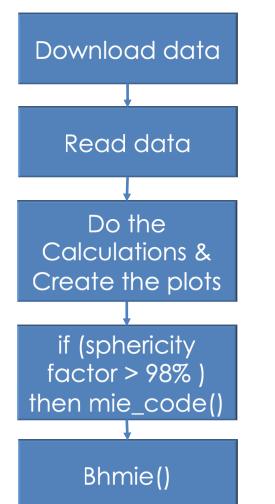
and a **fourth line** is created in the plot.



4th step Download data Antikythera NOA, N 35.861, E 23.310, Alt 193 m Size Distribution Almucantar Level 1.5; 05-09-2020 15-11-06 Reproduce AERONET SD - Wavelength=0.675 AERONET Data VSD AER calc Read data 0.030 VSD_AER_calc_new Fine - Coarse Mode 0.025 dV/dInR (um³ um²) Do the 0.020 Calculations & 0.015 Create the plots 0.010 if (sphericity 0.005 factor > 98%) 0.000 10⁰ 10^{-2} 10^{-1} 101 10^{2} then mie_code() radius (um)

The **pink line** is a **verification** point in the algorithm (it should coincide with the green line), showing that the size distribution we provide in the input is indeed the one that is used in the Mie calculations.



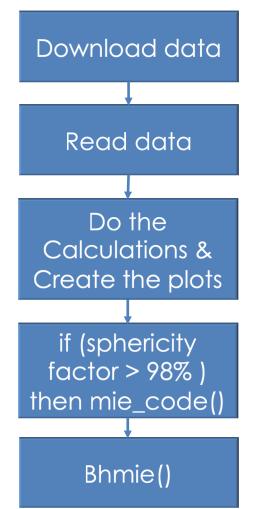


4th step

The mie_code() function uses **the bhmie() function** that calculates the **optical properties** of the **individual particle**, with specific size and refractive index.

The bhmie() function that was used in this thesis, was written in 1983 from **Craig F. Bohren and Donald R. Huffman.**





4th step

The mie_code() function uses **the bhmie() function** that calculates the **optical properties** of the **individual particle**, with specific size and refractive index.

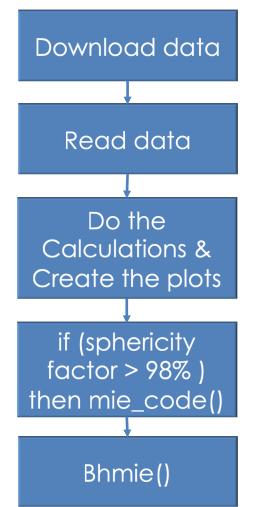
Inputs

□ The size parameter

The refractive index

The number of scattering angles





4th step

The mie_code() function uses **the bhmie() function** that calculates the **optical properties** of the **individual particle**, with specific size and refractive index.

Outputs

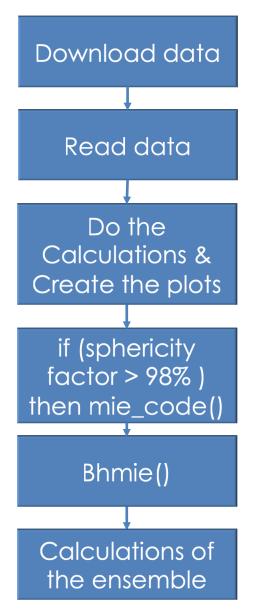
□ The extinction efficiency

□ The scattering efficiency

□ The **backscatter efficiency**

□ The absorption efficiency





5th step

In this step we calculate the **optical properties** of the **particle ensemble**, taking into account the size distribution of the particles in the ensemble:

□ The extinction coefficient

$$\varepsilon_{ext} = \int N(r)\sigma_{ext} dr = \int N(r)Q_{ext} \pi r^2 dr$$

□ The scattering coefficient

$$\varepsilon_{sca} = \int N(r)\sigma_{sca}\,dr = \int N(r)Q_{sca}\,\pi r^2\,dr$$

The backscatter coefficient

$$\varepsilon_{bck} = \int N(r) Q_{bck} \left(\frac{\lambda}{\pi r}\right)^2 dr$$

□ The absorption coefficient

$$\varepsilon_{abs} = \int N(r)\sigma_{abs} dr = \int N(r)Q_{abs} \pi r^2 dr$$

Results of the study



On the date of 27 of April on 2020, there are **no** available **data** from the Antikythera AERONET station, and the user is informed with the following message:

Start date is: year=2019&month=4&day=27 End date is: year2=2019&month2=4&day2=27&hour2=23 Wavelength is: 0.675 https://aeronet.gsfc.nasa.gov/cgi-bin/print_web_data_inv_v3? site=Antikythera_NOA&AVG=10&ALM15=1&if_no_html=1&product=SIZ&year=201 9&month=4&day=27&year2=2019&month2=4&day2=27&hour2=23 https://aeronet.gsfc.nasa.gov/cgi-bin/print_web_data_inv_v3? site=Antikythera_NOA&AVG=10&ALM15=1&if_no_html=1&product=VOL&year=201 9&month=4&day=27&year2=2019&month2=4&day2=27&hour2=23 https://aeronet.gsfc.nasa.gov/cgi-bin/print_web_data_inv_v3? site=Antikythera_NOA&AVG=10&ALM15=1&if_no_html=1&product=ASY&year=201 9&month=4&day=27&year2=2019&month2=4&day2=27&hour2=23 https://aeronet.gsfc.nasa.gov/cgi-bin/print_web_data_inv_v3? site=Antikythera_NOA&AVG=10&ALM15=1&if_no_html=1&product=RIN&year=201 9&month=4&day=27&year2=2019&month2=4&day2=27&hour2=23 Site=Antikythera_NO no data is available in this period: starting date=27/4/2019 and ending date=27/4/2019

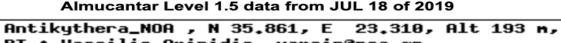


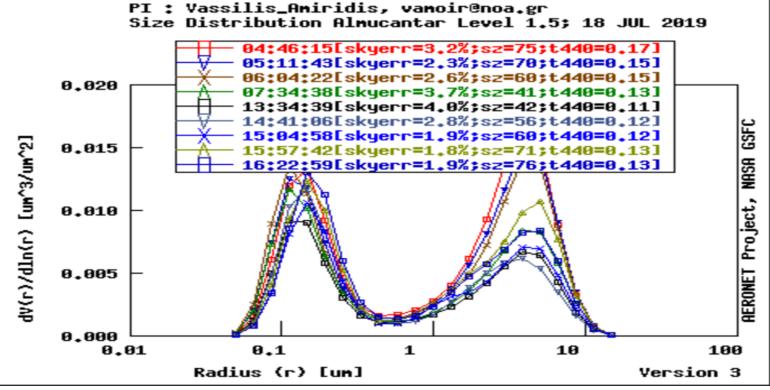
In this case, the **start and end date** are the **same**. The day is the 18th of July on 2019 and the **wavelength of refractive index is equal to 0.675** μ m. The data for this date is available as shown in the message below:

Start date is: year=2019&month=7&day=18 End date is: year2=2019&month2=7&day2=18 Wavelength is: 0.675 https://aeronet.gsfc.nasa.gov/cgi-bin/print_web_data_inv_v3? site=Antikythera_NOA&AVG=10&ALM15=1&if_no_html=1&product=SIZ&year=2019&month=7&da y=18&year2=2019&month2=7&day2=18 https://aeronet.gsfc.nasa.gov/cgi-bin/print_web_data_inv_v3? site=Antikythera_NOA&AVG=10&ALM15=1&if_no_html=1&product=VOL&year=2019&month=7&da y=18&year2=2019&month2=7&day2=18 https://aeronet.gsfc.nasa.gov/cgi-bin/print_web_data_inv_v3? site=Antikythera_NOA&AVG=10&ALM15=1&if_no_html=1&product=ASY&year=2019&month=7&da y=18&year2=2019&month2=7&day2=18 https://aeronet.gsfc.nasa.gov/cgi-bin/print_web_data_inv_v3? site=Antikythera_NOA&AVG=10&ALM15=1&if_no_html=1&product=RIN&year=2019&month=7&da y=18&year2=2019&month2=7&day2=18



This certain day, based on the AERONET site, there are **nine different retrievals** of the volume size distribution for different times during the day, as shown in the figure below: at 04:46:15, 05:11:43, 06:04:22, 07:34:38, 13:34:39, 14:41:06, 15:04:58, 15:57:42, 16:22:59 UTC







Creating plot for SIZ_Antikythera_N0_18-07-2019_04-46-15 SIZ_Antikythera_N0_18-07-2019_04-46-15 Sphericity_Factor 99.00 % volc_f=0.014000 vmr_f=0.148000 std_f=0.413000 volc_c=0.023000 vmr_c=3.132000 std_c=0.656000 rirp440=1.600000 rirp675=1.541400 rirp870=1.521200 rirp1020=1.524100 riip440=0.007420 riip675=0.006930 riip870=0.006592 riip1020=0.006531 RI 0.675

The **AERONET product for this case** provides the following aerosol properties:

- □ Total volume concentration of fine mode (volc_f) : 0.014000 cm³ cm⁻³
- □ Geometric mean volume radius of fine mode (vmr_f): 0.148000 µm
- Geometric standard deviation of fine mode (std_f): 0.413000
- □ Total volume concentration of coarse mode (volc_c): 0.023000 cm³ cm⁻³
- □ Geometric mean volume radius of coarse mode (vmr_c): 3.132000 µm
- Geometric standard deviation of coarse mode (std_c): 0.656000



Creating plot for SIZ_Antikythera_N0_18-07-2019_04-46-15 SIZ_Antikythera_N0_18-07-2019_04-46-15 Sphericity_Factor 99.00 % volc_f=0.014000 vmr_f=0.148000 std_f=0.413000 volc_c=0.023000 vmr_c=3.132000 std_c=0.656000 rirp440=1.600000 rirp675=1.541400 rirp870=1.521200 rirp1020=1.524100 riip440=0.007420 riip675=0.006930 riip870=0.006592 riip1020=0.006531 RI 0.675

The **AERONET product for this case** provides the following aerosol properties:

- **Real part of the refractive index** at 440 nm (rirp440): 1.600000
- □ Real part of the refractive index at 675 nm (rirp675): 1.541400
- **Real part of the refractive index** at 870 nm (rirp870): 1.521200
- **Real part of the refractive index** at 1020 nm (rirp1020): 1.524100
- □ Imaginary part of the refractive index at 440 nm (riip440): 0.007420
- □ Imaginary part of the refractive index at 675 nm (riip675): 0.006930
- □ Imaginary part of the refractive index at 870 nm (riip870): 0.006592
- □ Imaginary part of the refractive index at 1020 nm (riip1020): 0.006531



ext_all=7.909338890331058e-05 sca_all=7.346999408914502e-05 abs_all=5.623394814165551e-06 bac_all=2.032112840574509e-06 ext_f=6.52076043790471e-05 sca_f=6.241395193588643e-05 abs_f=2.7936524431606673e-06 bac_f=1.3391959966208895e-06 ext_c=1.388578452426348e-05 sca_c=1.1056042153258596e-05 abs_c=2.829742371004884e-06 bac_c=6.929168439536193e-07

The calculated **outputs** for this case are the following:

- **Extinction coefficient of the ensemble** (ext_all): 7.909338 Km⁻¹
- □ Scattering coefficient of the ensemble (sca_all): 7.346999 Km⁻¹
- □ Absorption coefficient of the ensemble (abs_all): 5.623394 Km⁻¹
- **Backscatter coefficient of the ensemble** (bac_all): 2.032112 Km⁻¹ sr⁻¹
- □ Extinction coefficient of the fine mode (ext_f): 6.520760 Km⁻¹
- □ Scattering coefficient of the fine mode(sca_f): 6.241395 Km⁻¹
- **Absorption coefficient of the fine mode** (abs_f): 2.793652 Km⁻¹
- □ Backscatter coefficient of the fine mode (bac_f): 1.339195 Km⁻¹ sr⁻¹



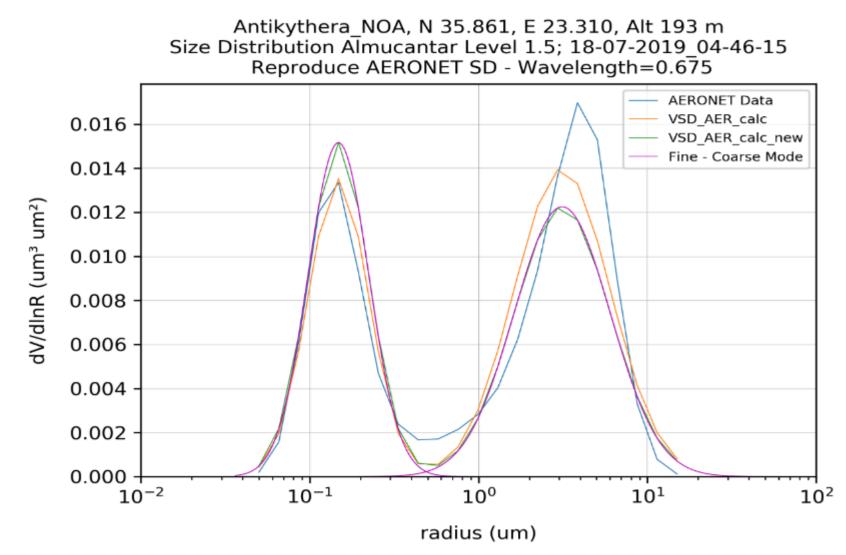
ext_all=7.909338890331058e-05 sca_all=7.346999408914502e-05 abs_all=5.623394814165551e-06 bac_all=2.032112840574509e-06 ext_f=6.52076043790471e-05 sca_f=6.241395193588643e-05 abs_f=2.7936524431606673e-06 bac_f=1.3391959966208895e-06 ext_c=1.388578452426348e-05 sca_c=1.1056042153258596e-05 abs_c=2.829742371004884e-06 bac_c=6.929168439536193e-07

The calculated **outputs** for this case are the following:

- **Extinction coefficient of the coarse mode** (ext_c): 1.388578 Km⁻¹
- □ Scattering coefficient of the coarse mode (sca_c): 1.105604 Km⁻¹
- □ Absorption coefficient of the coarse mode (abs_c): 2.829742 Km⁻¹
- □ Backscatter coefficient of the coarse mode (bac_c): 6.929168 Km⁻¹ sr⁻¹



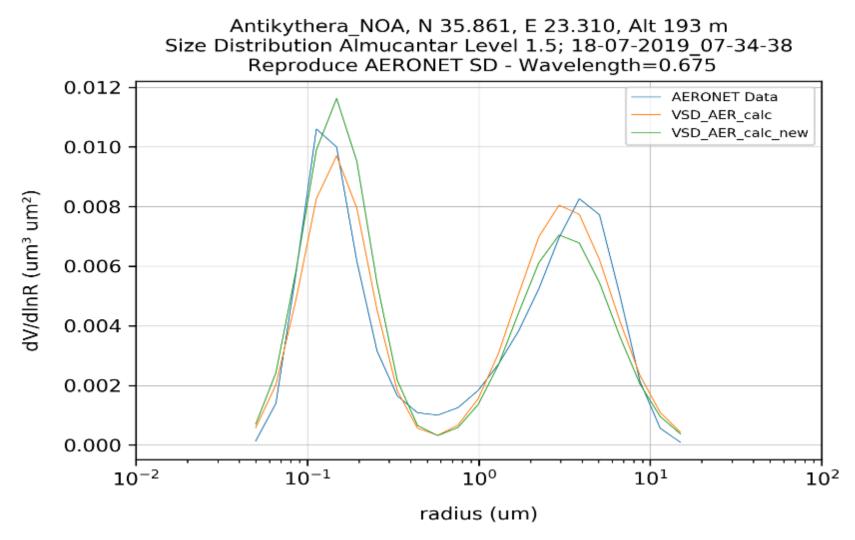








Time: 07:34:38









The developed tool focuses mainly on the lidar-related optical properties.



These properties can be used in the future step of this work, for combining the sun-photometer with lidar measurements for better characterization of aerosol vertical properties.









The goal of this work was to create an **automated tool** that calculates in near **real-time the optical properties** of aerosol particles observed in the **PANGEA observatory**, when the particles have **spherical shapes**. For this scope we use the **sun-photometer measurements** in the station, the **AERONET inversion products** and the **Mie scattering code**.





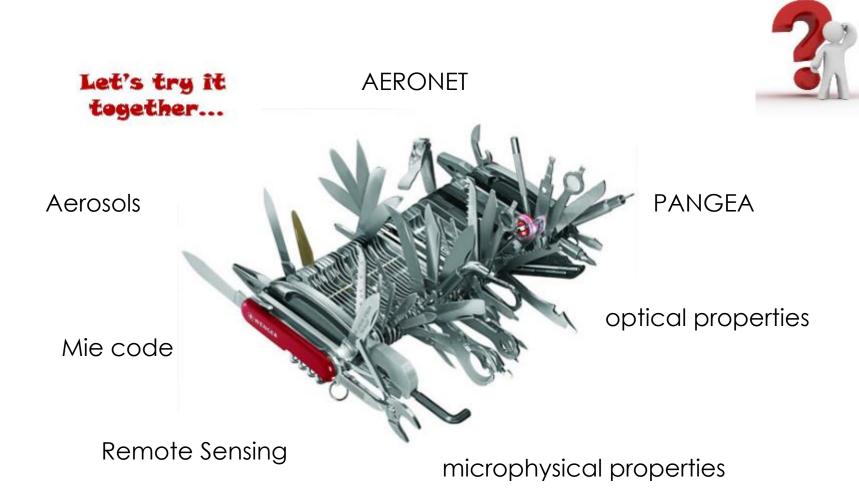


My supervisor Dr. Vassilis Amiridis

The postdoctoral researcher Alexandra Tsekeri

Questions?





Backup Slides





AERONET data display uses a **user-friendly interface** that includes **graphical representations** to display the optical and microphysical properties of the aerosol particles.

There are three versions available for the AERONET aerosol product:

- Version 1.0
- Version 2.0
- Version 3.0

Data quality levels for Direct Sun algorithm:

- Level 1 (unscreened)
- Level 1.5 (cloud-screened and quality controlled)
- Level 2.0 (quality-assured)

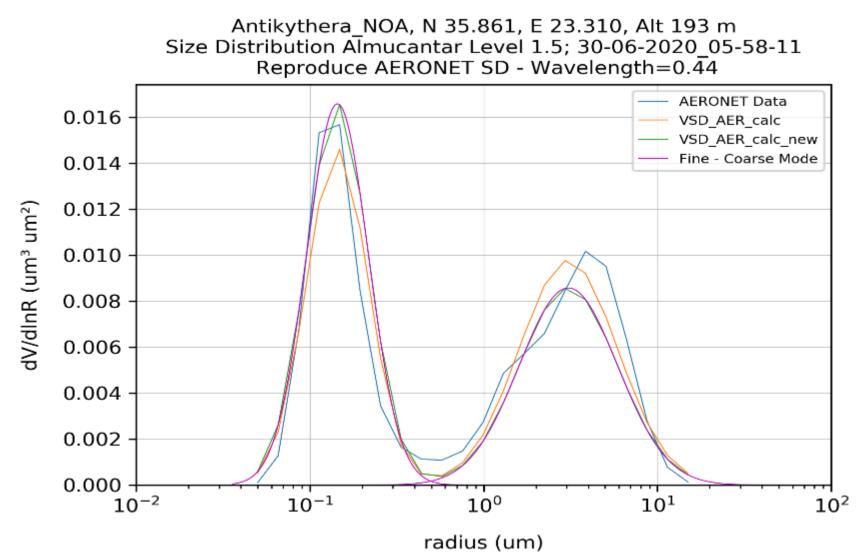
Data quality levels for Direct Sun and Inversion algorithm:

- Inversion Level 1.5 (cloudscreened and quality controlled)
- Inversion Level 2.0 (quality-assured)





Time: 05:58:11



Master thesis, September 18 2020 - Anastasia Georgiou NOA (MSc SSTA)