A Tutorial of Earth System Model Aerosol-Cloud Diagnostics Package (ESMAC Diags)

Shuaiqi Tang
Jerome Fast
Adam Varble
Kai Zhang
Joseph Hardin
Po-Lun Ma

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What is it?

- Diagnostics tool to evaluate earth system models (currently E3SM)

- Focusing on aerosols, clouds and aerosol-cloud interactions

- Using in-situ and remote-sensing measurements from ARM and other field campaign measurements

- Python-based open-source package

The goal is to facilitate the routine evaluation of aerosols, clouds and aerosol-cloud interactions in E3SM and provide insights to guide future model development.

Tutorial Overview

- How to download and install it?

- How to get prepared observational data?

- How to prepare E3SM output?

- How to make diagnostics plots and metrics?

- References and links
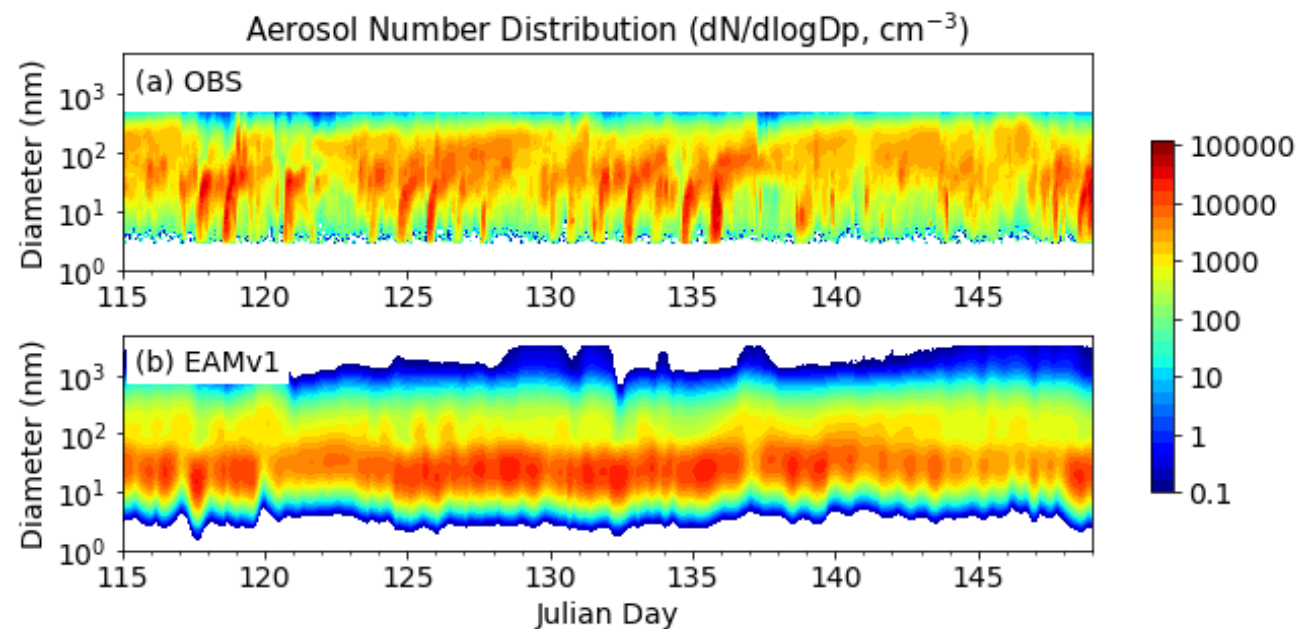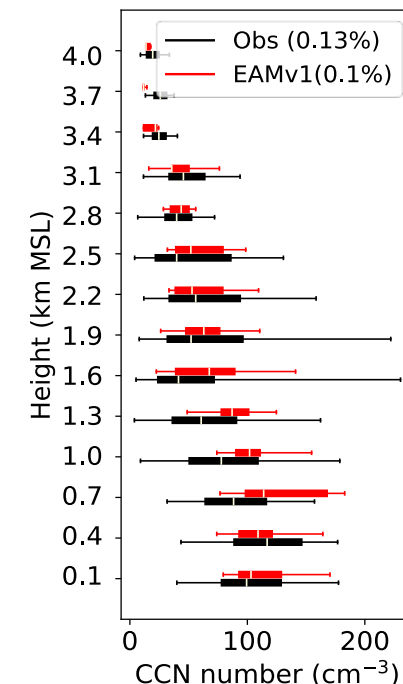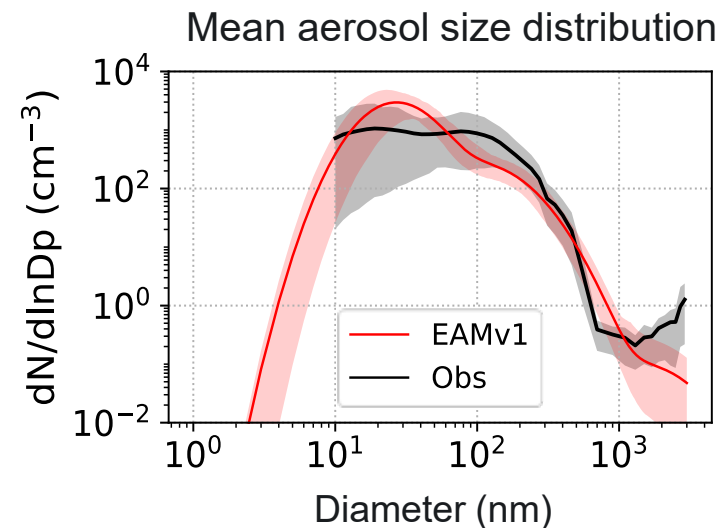
How to download and install it?

- Download code from github:
    https://github.com/eagles-project/ESMAC_diags
or clone it in a terminal:
    > *git clone https://github.com/eagles-project/ESMAC_diags*

- This code is best run using a conda virtual environment. To install it (example shows for NERSC super computer):
   > *cd ESMAC_diags/*
    > *conda env create -f environment.yml*
    > *conda activate esmac_diags*
    > *pip install -e .*

- Use the branch for this tutorial:
    > *git checkout -b esmac_diags_tutorial origin/esmac_diags_tutorial*

How to get prepared observational data?

- All the observational data can be downloaded from ARM and other agencies. Information of all observational data can be found in README_ESMAC_Diags_v2.0.0.pdf (on github).

- The input observational data are processed, quality-controlled, and changed time resolution (median, mean or interpolate) to facilitate evaluation of E3SM output.

- All prepared observational data are currently available on NERSC (temporarily): /global/cscratch1/sd/sqtang/EAGLES/ESMAC_Diags_v2/prep_data/. We are working with ARM to release it as a data bundle, or archive in public repository.

- Another option is to run prep_* script to prepare observational data
    > *cd scripts*
    > *python prep_HISCALE_allobs.py*
    (source code are under src/esmac_diags/preprocessing/)

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Field campaigns currently included in ESMAC Diags
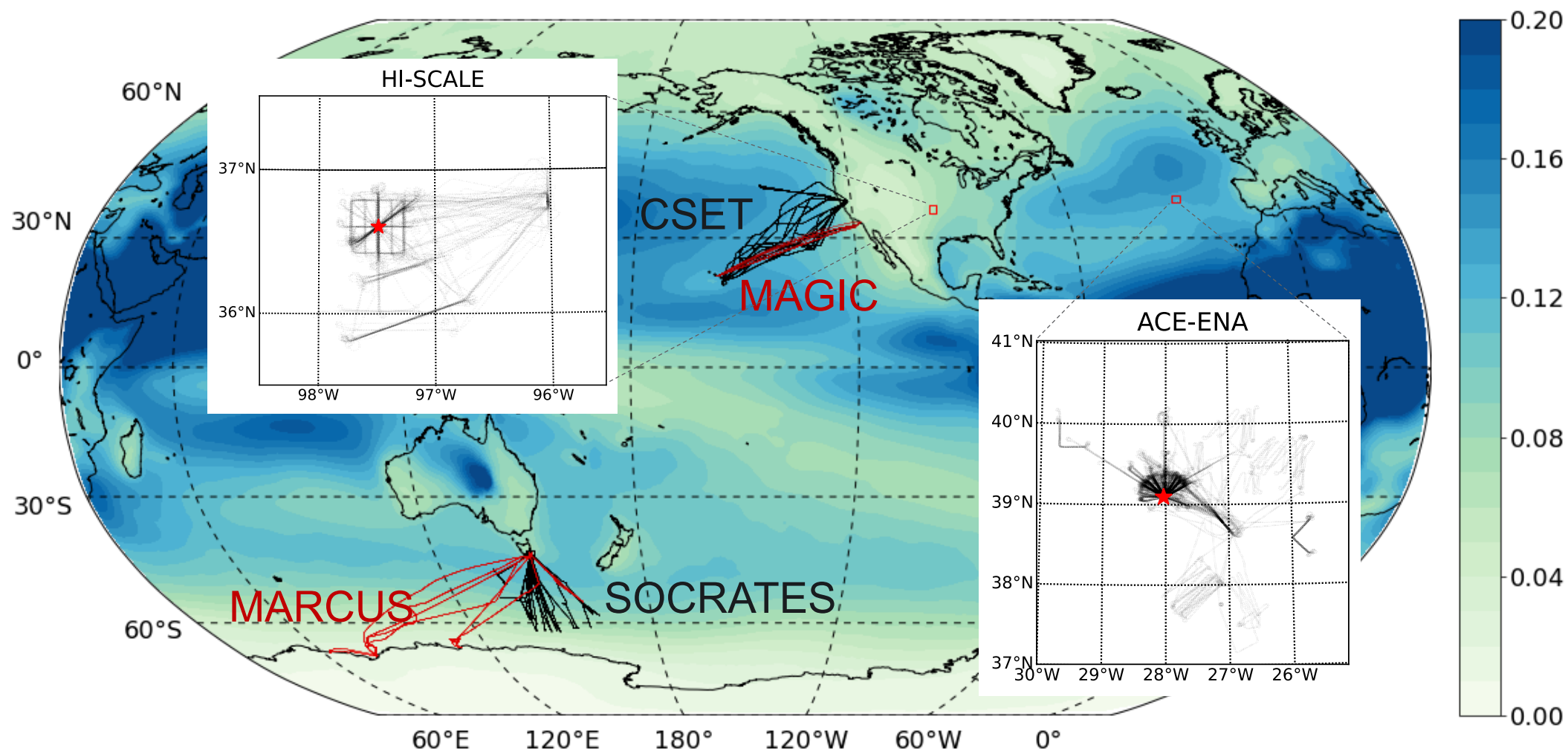
Aircraft (black) and ship (red) tracks of the six field campaigns. Overlaid shading is mean AOD in E3SM

Descriptions of the field campaigns used in this study. Numbers after aircraft or ship represent number of flights or ship trips in each field campaign or IOP.

	Period	Measuring platform	Cloud/Aerosol properties	Reference
HI-SCALE	IOP1: 24 Apr – 21 May 2016 IOP2: 28 Aug – 24 Sep 2016	Ground, aircraft (IOP1: 17, IOP2: 21)	Continental shallow cumulus clouds	(Fast et al. 2019)
ACE-ENA	IOP1: 21 Jun – 20 Jul 2017 IOP2: 15 Jan – 18 Feb 2018	Ground, aircraft (IOP1: 20, IOP2: 19)	Marine PBL clouds	(Wang et al., 2021)
MAGIC	Oct 2012 – Sep 2013	Ship (18)	Stratocumulus to cumulus transition	(Lewis and Teixeira 2015; Zhou et al. 2015)
CSET	1 Jul – 15 Aug 2015	Aircraft (16)	Same as above	(Albrecht et al. 2019)
MARCUS	Oct 2017 – Apr 2018	Ship (4)	Pristine region with low aerosol loading	(McFarquhar et al. 2021)
SOCRATES	15 Jan – 24 Feb 2018	Aircraft (14)	Same as above	(McFarquhar et al. 2021)

ESMAC Diags v2 will also include long-term diagnostics at SGP (2011-2020) and ENA (2016-2018)

How to prepare E3SM output?
(1) E3SM simulation

High-frequency (e.g., hourly) E3SM output is needed for diagnostics in ESMAC Diags

A full list of variables needed in output is included in the README PDF file (or contact me)

E3SM output needed in ESMAC Diags

```
E3SMv2_HISCALE_test.eam.h1.2016-09-08-00000.nc
E3SMv2_HISCALE_test.eam.h1.2016-09-09-00000.nc
E3SMv2_HISCALE_test.eam.h1.2016-09-10-00000.nc
E3SMv2_HISCALE_test.eam.h1.2016-09-11-00000.nc
E3SMv2_HISCALE_test.eam.h1.2016-09-12-00000.nc
E3SMv2_HISCALE_test.eam.h1.2016-09-13-00000.nc
E3SMv2_HISCALE_test.eam.h1.2016-09-14-00000.nc
E3SMv2_HISCALE_test.eam.h1.2016-09-15-00000.nc
E3SMv2_HISCALE_test.eam.h1.2016-09-16-00000.nc
E3SMv2_HISCALE_test.eam.h1.2016-09-17-00000.nc
E3SMv2_HISCALE_test.eam.h1.2016-09-18-00000.nc
```

```
!...............................................
! namelist for controlling the output
!...............................................
nhtfrq       = 0,-1
mfilt        = 1,24
avgflag_pertape ='A','I',
fincl1       = 'FREQR',
               'PS'
fincl2       = 'PS',          !! dynamical fields
               'U',           !! ..
               'V',           !! ..
```

```
               'ABSORB',      !! Aerosol absorption (1/m)
fincl2lonlat = '260e:265e_34n:39n',   ! SGP (~5x5 degs)
!              '330e:335e_37n:42n',   ! ENA
! Only output hourly '202e:240e_19n:40n',   ! CSET
! data in campaign '60e:160e_42s:70s',   ! MARCUS
! region          '133e:164e_42s:63s',   ! SOCRATES
!                 '202e:243e_20n:35n',   ! MAGIC
```

How to prepare E3SM output?
(2) prepare E3SM data

- run prep_* script to prepare observational data
  - > *cd scripts*
  - > *python prep_HISCALE_E3SM.py*
  - (source code are under src/esmac_diags/preprocessing/)

```
E3SMv2_HISCALE_flight_20160920b.nc
E3SMv2_HISCALE_flight_20160921a.nc
E3SMv2_HISCALE_flight_20160922a.nc
E3SMv2_HISCALE_profiles.nc
E3SMv2_HISCALE_sfc.nc
```

E3SM output at the nearest grid and time along aircraft track.

Vertical profiles (in pressure and height coordinates) for U, V, T, Q, RH, CLOUD, etc.

Single-level variables, including surface/TOA and column-integrated variables
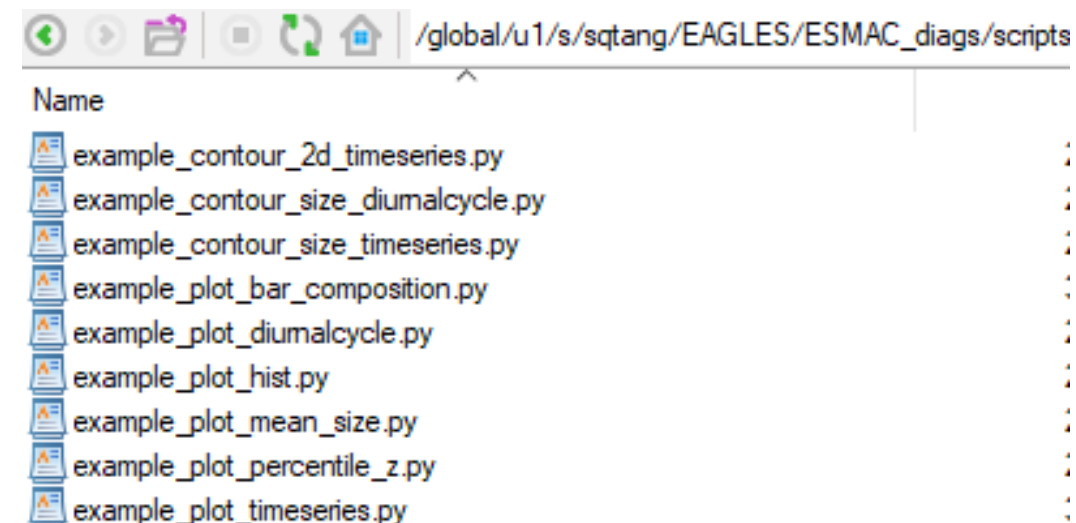
How to make diagnostics plots and metrics?

If you use conda virtual environment, every time when you re-open the terminal, you need to re-activate the package:

> *conda activate esmac_diags*

```
(base) sqtang@cori02:~/EAGLES/ESMAC_diags>
(base) sqtang@cori02:~/EAGLES/ESMAC_diags> conda activate esmac_diags
(esmac_diags) sqtang@cori02:~/EAGLES/ESMAC_diags>
```

Example diagnostics scripts are given in ESMAC_diags/scripts/

Hand-on exercise on diagnostics plots at:
ESMAC_diags/ESMAC_Diags_tutorial_case/scripts/

/global/u1/s/sqtang/EAGLES/ESMAC_diags/scripts

Name
- example_contour_2d_timeseries.py
- example_contour_size_diurnalcycle.py
- example_contour_size_timeseries.py
- example_plot_bar_composition.py
- example_plot_diurnalcycle.py
- example_plot_hist.py
- example_plot_mean_size.py
- example_plot_percentile_z.py
- example_plot_timeseries.py

Useful links and references

ESMAC Diags github: https://github.com/eagles-project/ESMAC_diags
include source code and detailed README file

Reference on ESMAC Diags v1:
Tang, S., Fast, J. D., Zhang, K., Hardin, J. C., Varble, A. C., Shilling, J. E., Mei, F., Zawadowicz, M. A., and Ma, P.-L.: Earth System Model Aerosol-Cloud Diagnostics Package (ESMAC Diags) Version 1: Assessing E3SM Aerosol Predictions Using Aircraft, Ship, and Surface Measurements, Geosci. Model Dev. Discuss. [preprint], https://doi.org/10.5194/gmd-2021-350, in review, 2021

E3SM information and guidance:
https://e3sm.org/
https://github.com/E3SM-Project/E3SM

Questions or comments: Shuaiqi Tang (shuaiqi.tang@pnnl.gov)