

Reflections on using Satellite Data as Model Constraints

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AeroSAT, Barcelona, 2019

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(for quantifying aerosol radiative forcing)

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Aerosol Radiative Forcing

$$\Delta F_{TOA} = \underbrace{-F^\downarrow}_{\text{solar flux}} \underbrace{C \alpha_c}_{\text{cloud albedo}} (1 - \alpha_c) \underbrace{\frac{d \ln N_d}{d \ln AOD} \left(\frac{1}{3} + \frac{5}{6} \frac{\Delta \ln \mathcal{L}}{\Delta \ln N_d} + \frac{\Delta \ln C}{\Delta \ln N_d} \right)}_{\text{cloud sensitivity}} \underbrace{\Delta \ln AOD_{anth}}_{\text{anthropogenic aerosol}}$$

solar flux
Kopp & Lean (2011)

cloud albedo
Loeb et al. (2018)
Platnick et al. (2017)

cloud sensitivity
Gryspeerdt et al (2016); Andersen et al (2017)
Christensen et al. (2017); Possner et al. (2018)
Bellouin et al. (under review)

anthropogenic aerosol
Reanalysis: Bellouin et al. 2013
MODIS fine mode AOD: Kaufman et al. 2005

| | | | |
|---------------------|------|-----------|-----|
| Uncertainty: 0.035% | 7.5% | 50 - 200% | 40% |
|---------------------|------|-----------|-----|

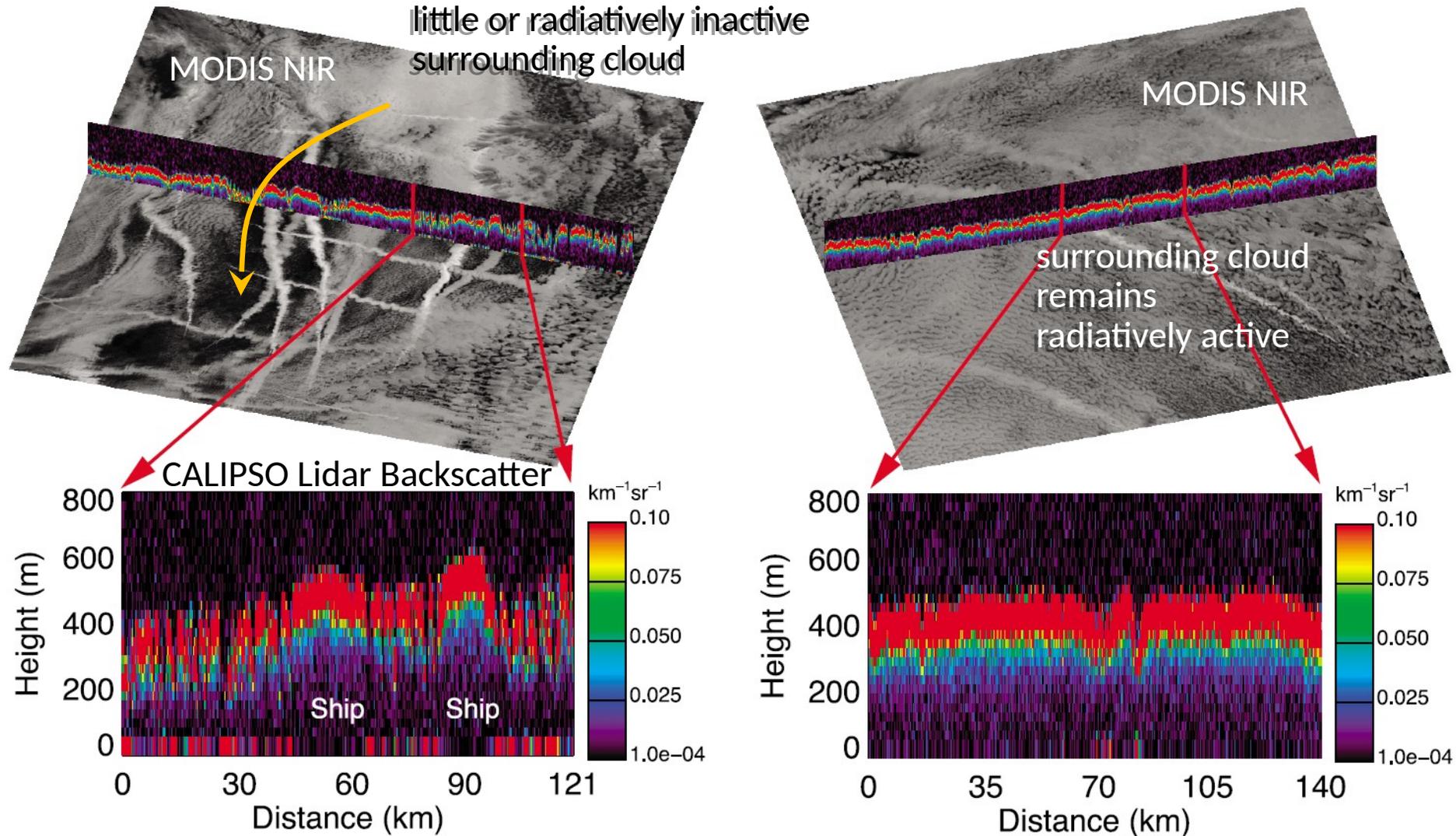
(5-95th %)

- Bulk of uncertainty stems from cloud sensitivities constructed from linear statistics of the regression between retrieved cloud and aerosol properties.
- Forcing is directly proportional to anthropogenic aerosol fraction so constraining this term is also essential.

Why is the uncertainty on cloud sensitivity so large?

ΔF_{TOA} : radiative effect
 F^\downarrow : incoming solar flux
 C : cloud fraction;
 α_c : cloud albedo
 \mathcal{L} : liquid water path
 N_d : droplet concentration
 AOD : aerosol optical depth
 $anth$: anthropogenic aerosol

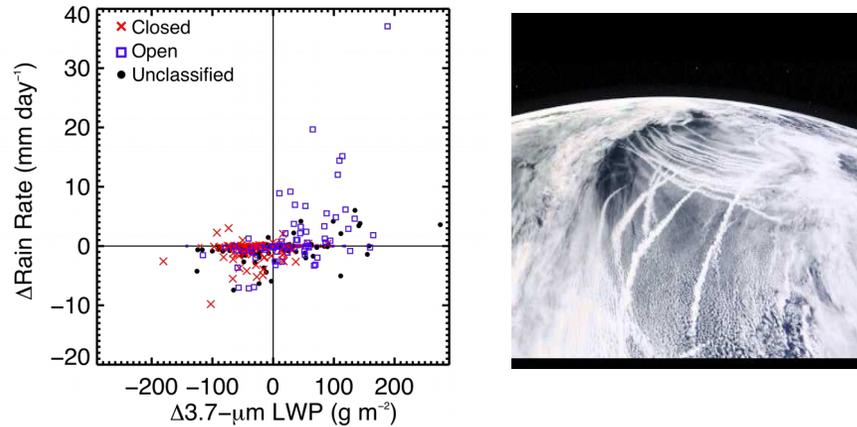
Evidence of Cloud Deepening



Cloud Sensitivity - ACI Adjustments

Ship & Volcano Tracks

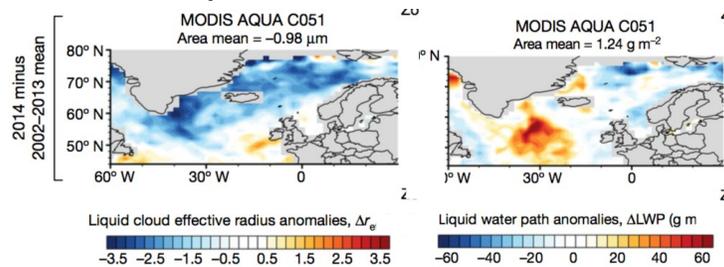
- LWP responses can be positive or negative



Christensen and Stephens (2012)
Toll et al. (2017)

Holuhraun volcanic eruption

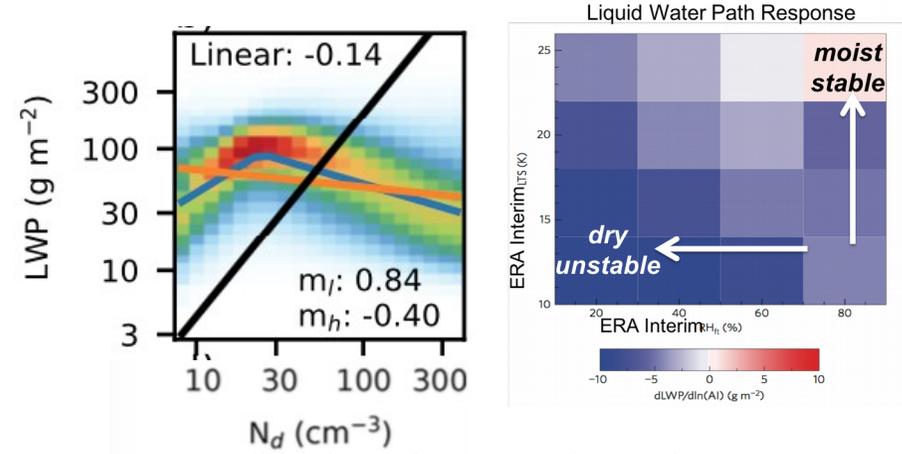
- No impact on LWP observed



Malavelle et al. (2017)

Synoptic Scale LWP Response - meteorology

- LWP decreases on average

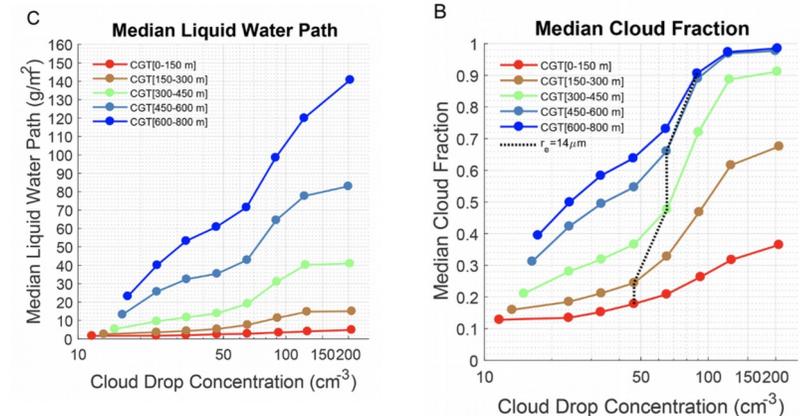


Gryspeerd et al. (2018)

Chen et al (2014)

Synoptic Scale Cloud Fraction Response

- Significant increase in cloud fraction

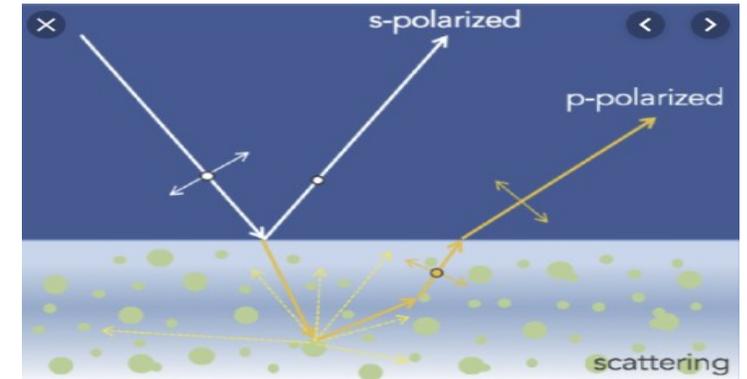


Rosenfeld et al. (2019)

Pathways to Reduce Uncertainty

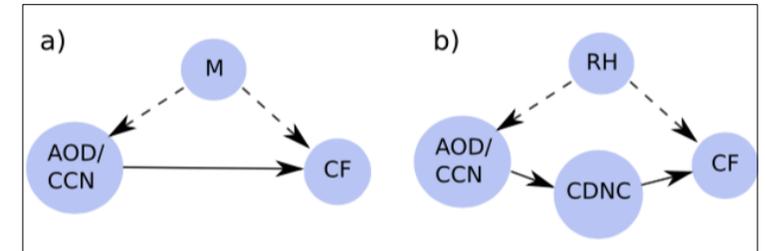
Better aerosol & cloud retrievals

- Clear-sky pixels
 - CCN retrievals from high-precision multiangle polarization measurements (Mishchenko et al. 1997, Hasekamp et al. 2019)
 - Remove 3D effects and cloud contamination near clouds (Christensen et al. 2017)
- Cloudy-sky pixels
 - Relate CDNC to CCN through adiabatic cores (Rosenfeld et al. 2019)



Account for confounders/mediating variables

- Mediate cloud responses by relative humidity (Gryspeerd et al. 2016, JGR)
- Stratify cloud responses by precipitation and meteorology (Chen et al., 2014)

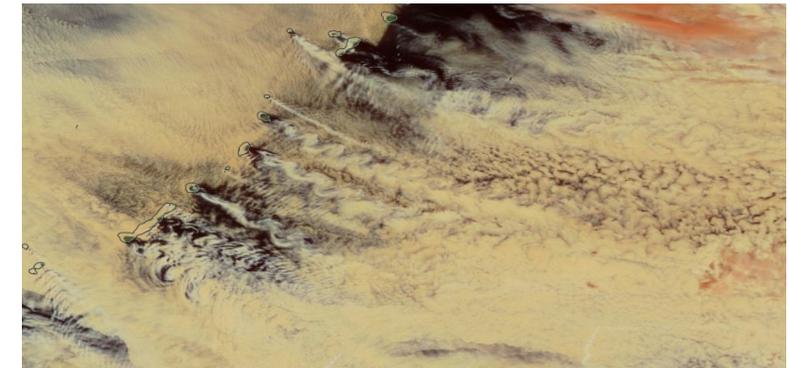


Geostationary satellite observations

- Lagrangian trajectories to connect cloud to aerosol history and precipitation changes.

Natural Laboratories to improve process-scale understanding

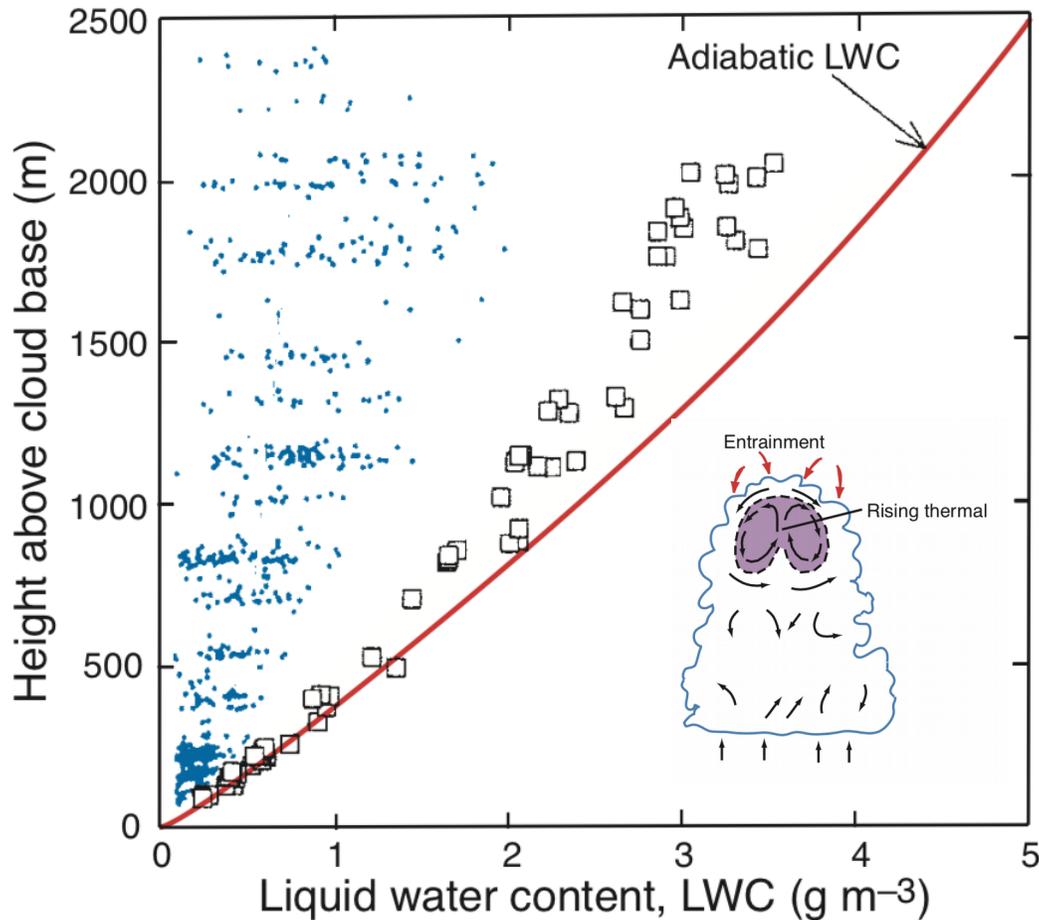
- Quantify perturbations from known aerosol sources occurring in similar meteorology
- Ship, volcano industrial and megacity tracks (Christensen et al., 2011; Toll et al. 2019)



Challenges

- Aerosol-cloud collocation
 - Spatial size of domain is critical to ensure the cloud and aerosol are in the same location (Grandey and Stier, 2010)
 - **CAPA** to link individual cloud pixels to nearest *trustworthy* aerosol retrieval
 - Trajectory method linking aerosol to cloud (Breon et al. 2002).
- Aerosol composition and vertical profile
 - Black carbon aerosol layers above cloud induce semi-direct effects (Wilcox,2010)
 - MODIS standard retrieval products contain retrieval biases in cloud properties under smoke layers (Meyer et al.)
 - CALIPSO is useful but may have difficulty retrieving semi-detached aerosol layers
 - ORACLES show that aerosol mixing with cloud can have different effects (Diamond et al. 2018)
- AOD threshold retrieval considerations
 - MODIS suitable range is 0.06 – 1 and clouds are most sensitive in clean conditions below 0.06
 - MISR might be better
 - CALIPSO has similar difficulty retrieving optically thin layers
- Quasi-buffered cloud states
 - Feedbacks between entrainment and precipitation buffer cloud albedo effect (Stevens and Feingold, 2008).

Cloud Retrievals



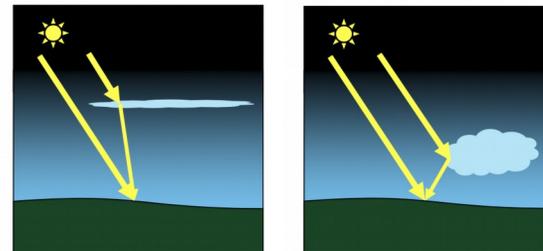
Source: Wallace and Hobbs, 2006

Adiabaticity - assumed adiabatic in most Sc clouds

$$N_{eff} = \sqrt{2} B^3 \Gamma_{eff}^{1/2} \frac{LWP^{1/2}}{r_e(h)^3}$$

LES experiments LWP differs by 2x depending on the degree of sub-adiabaticity (Miller et al. 2016).

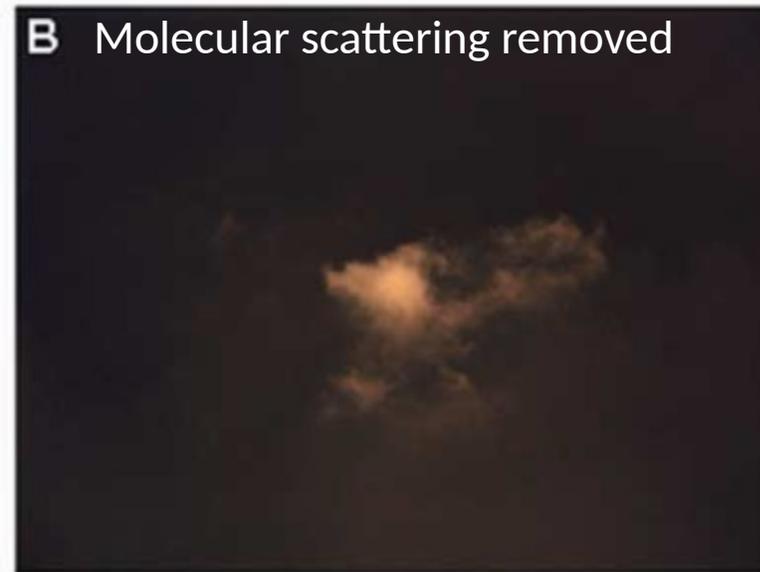
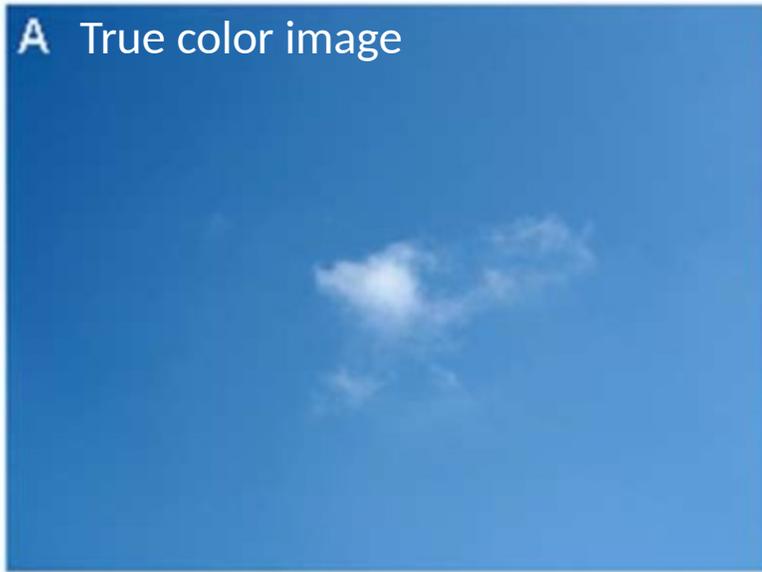
Plane parallel clouds - 1D radiative transfer



Broken cloudy areas need constraints!

Uncertainty in CDNC is between **50 - 80%** (Grosvenor et al. 2018).

Into the Twilight Zone



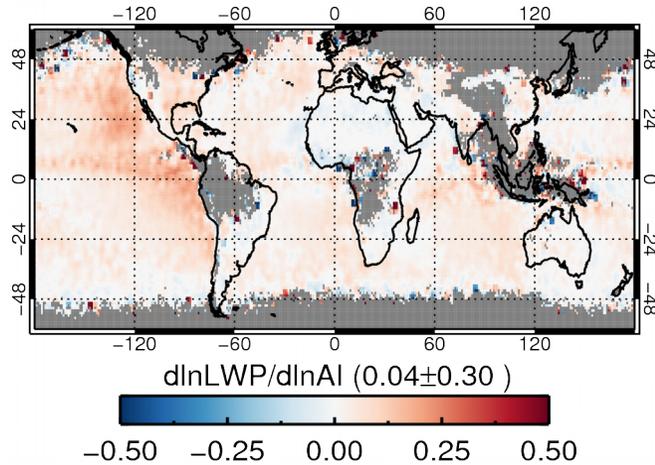
Koren et al. (2007), GRL

- Clouds are surrounded by the “*twilight zone*”
 - Belt of forming and evaporating cloud fragments and hydrated aerosols extending tens of km.
- To what extent does the twilight zone influence estimates of the aerosol indirect forcing?
 - In situ estimates from Ted Van Hoesve 2016
 - Satellite based estimates from Christensen et al. 2017, ACP

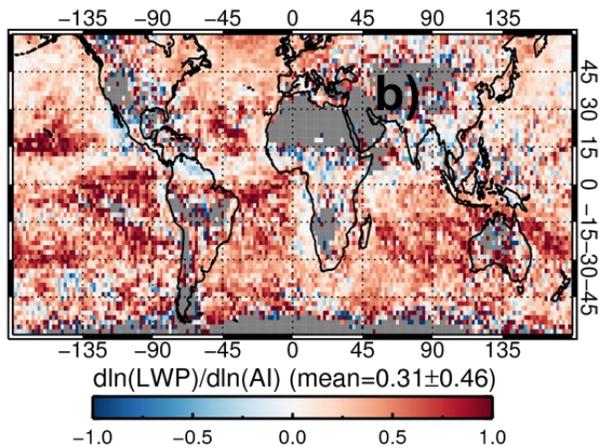
Satellite-Model Comparison

Cloud Water Path Sensitivity Satellite-Model Comparisons
2006 – 2010; 60S° – 60° N (Ocean only)

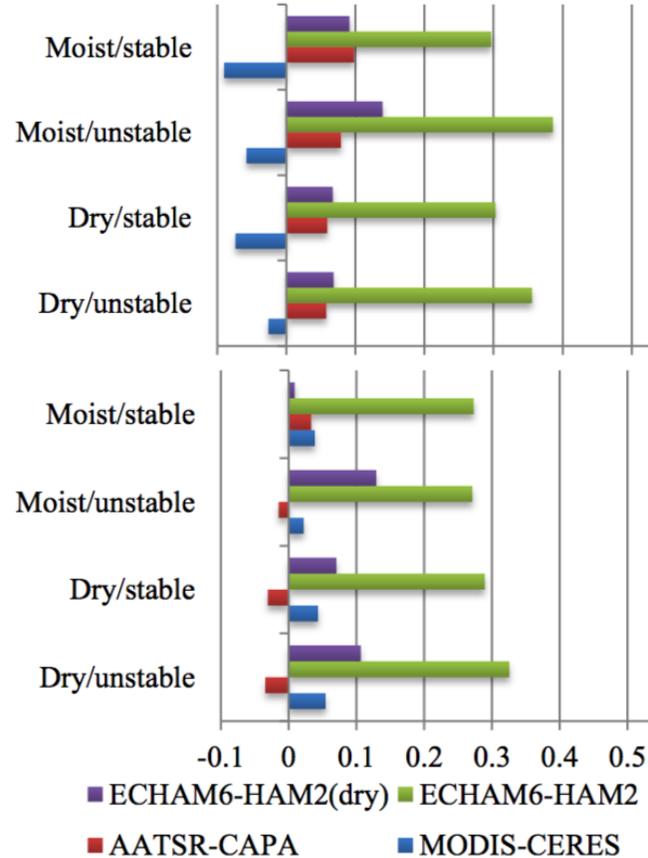
Satellite: AATSR



Model: ECHAM6 HAM 2



Liquid water path sensitivity



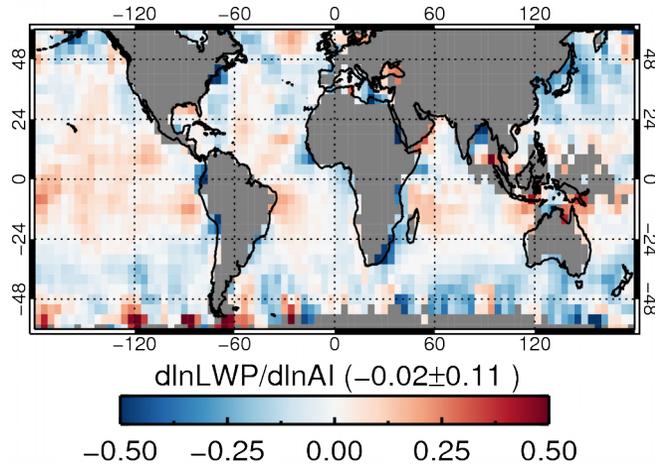
Neubauer et al.
(2017), ACP

Satellites disagree on the sign but agree on magnitude
Improvement in model is observed if using dry aerosol.

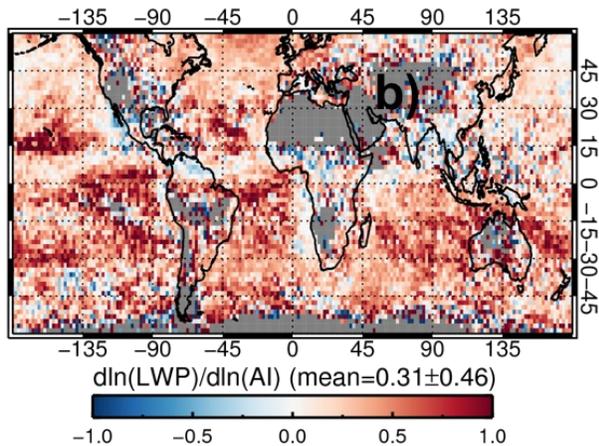
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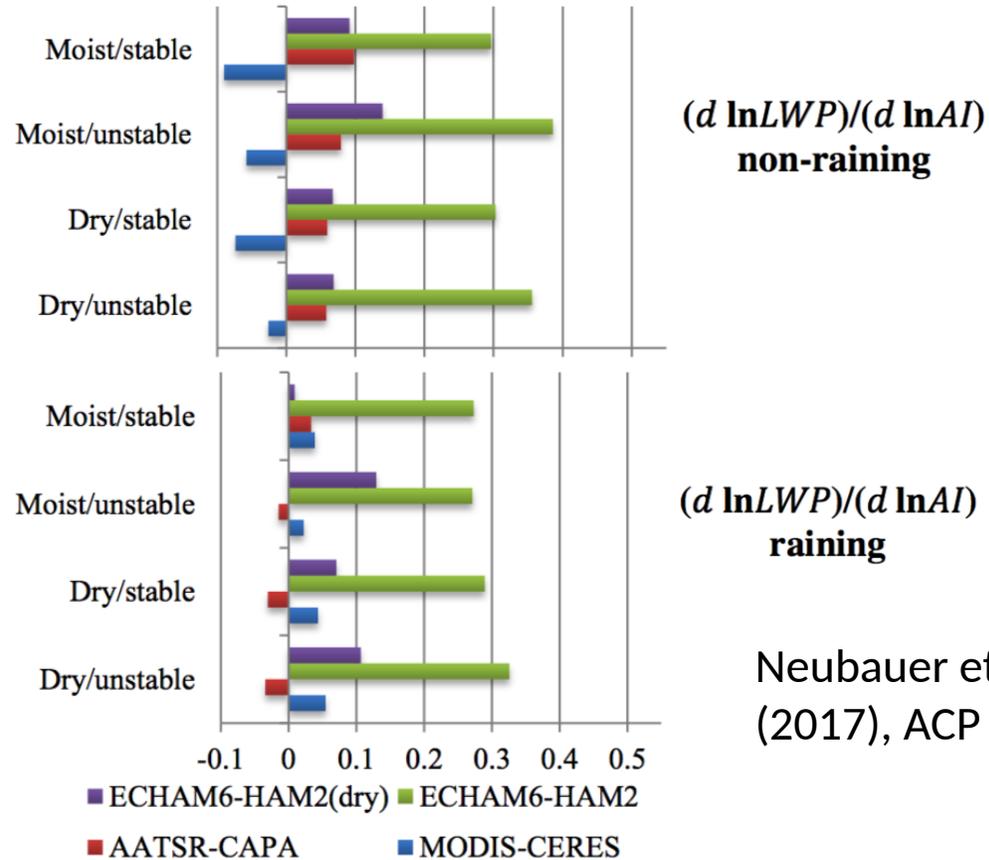
Satellite: MODIS



Model: ECHAM6 HAM 2

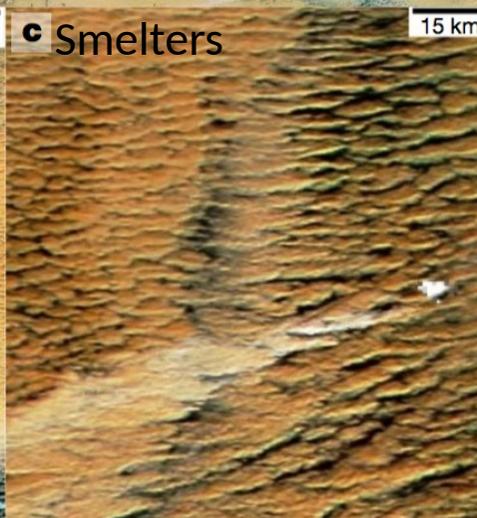
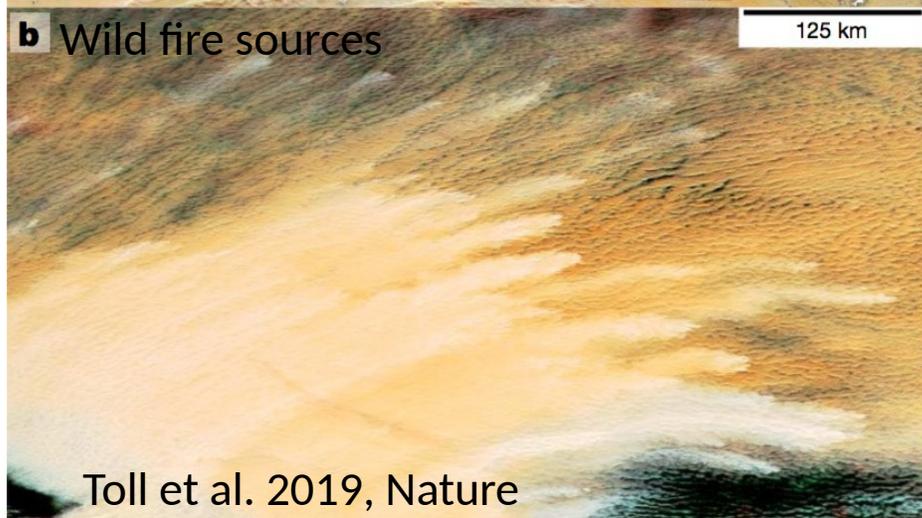
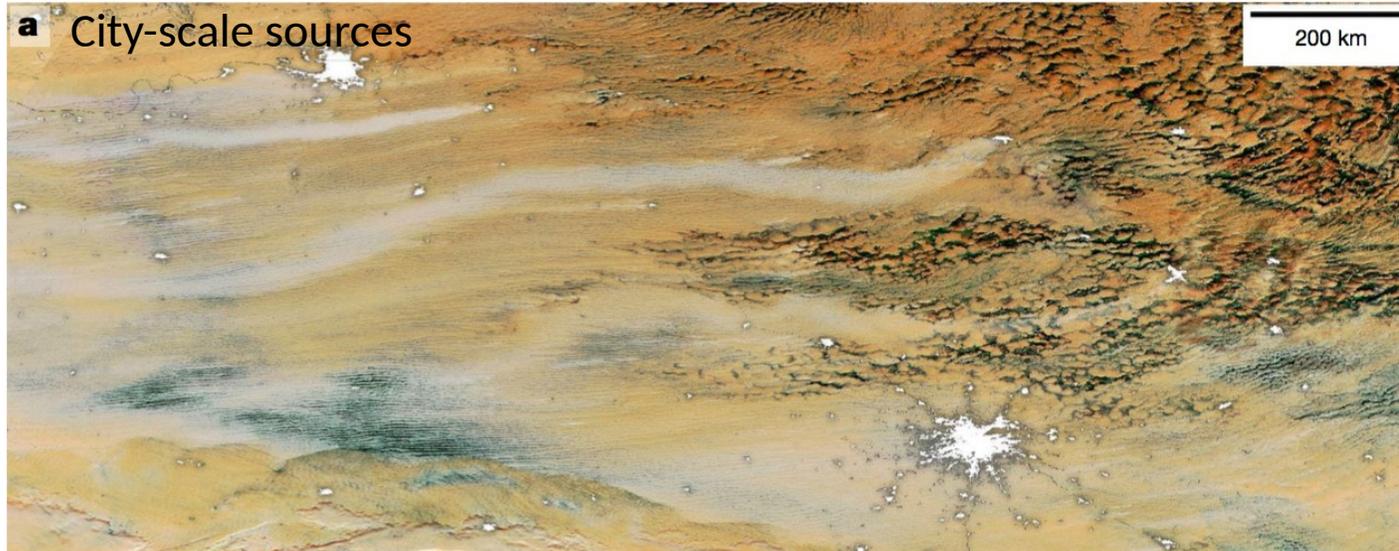


Liquid water path sensitivity

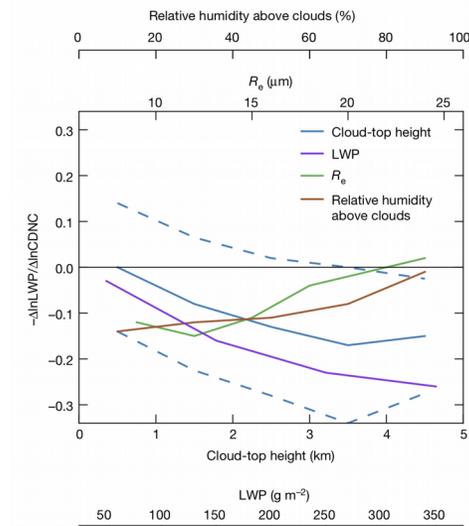
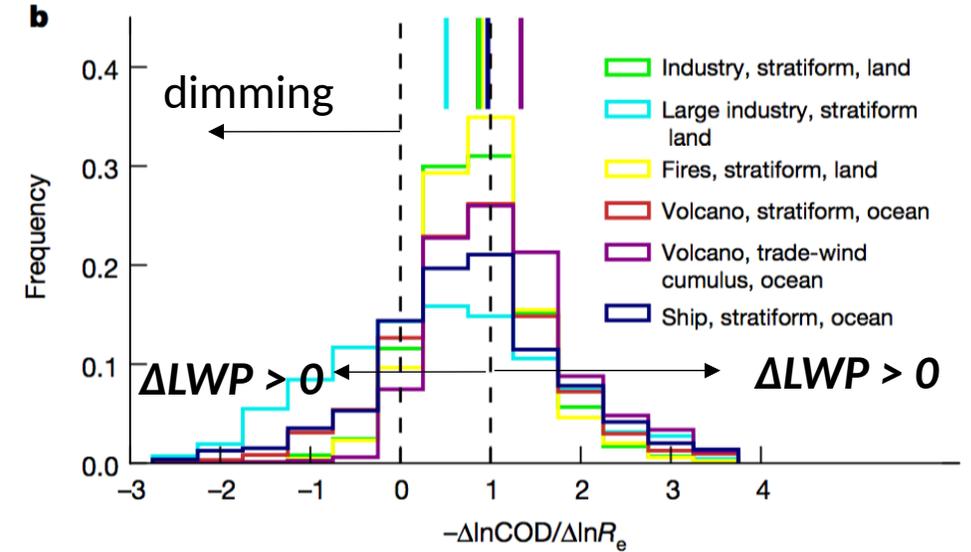


Satellites disagree on the sign but agree on magnitude
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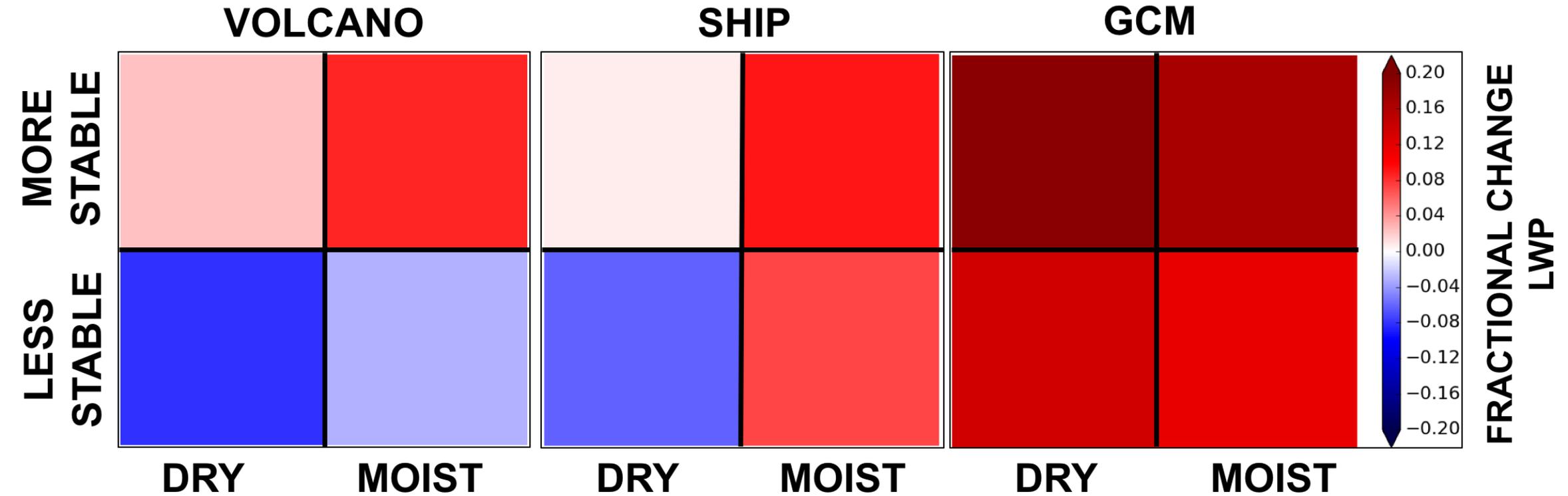
Natural and Anthropogenic Laboratories



Toll et al. 2019, Nature

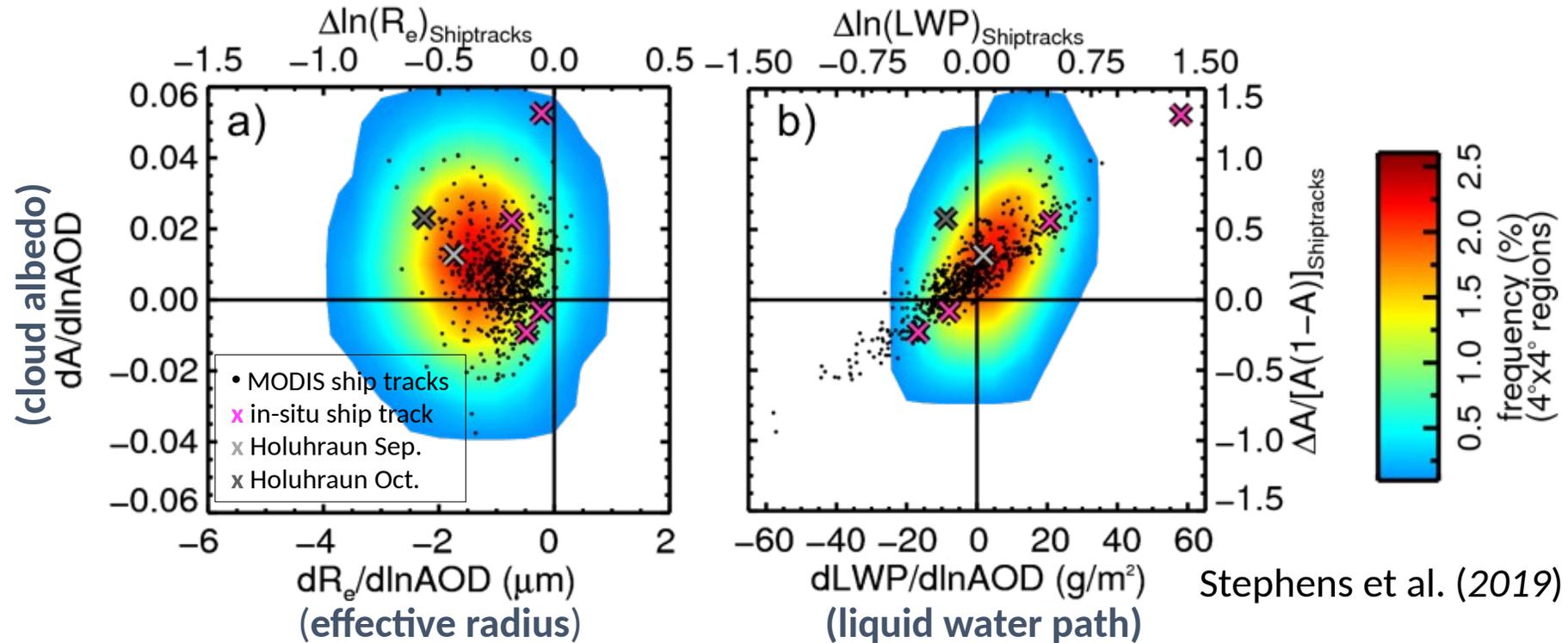


Ship and Volcano Track Responses



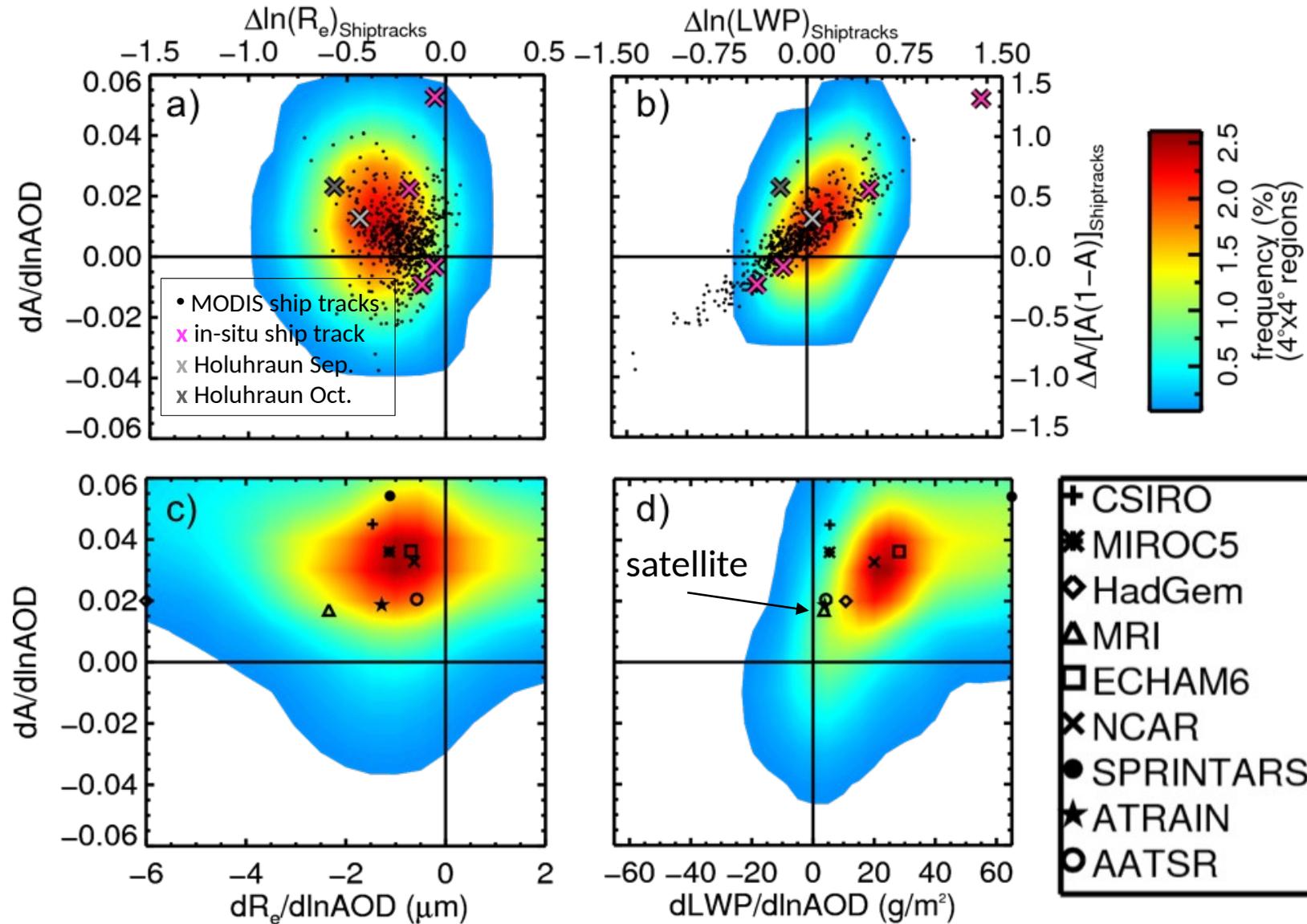
- HADGEM LWP response shows no dependence on meteorology.

Cloud Albedo Comparison

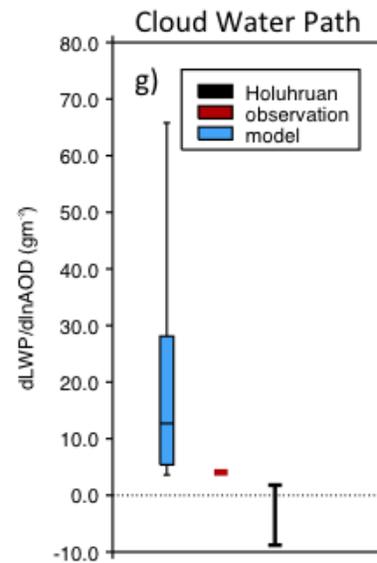
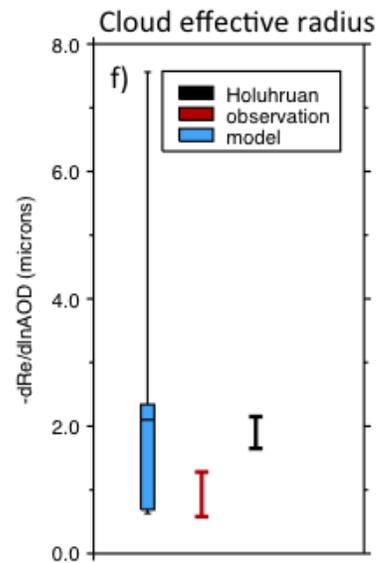
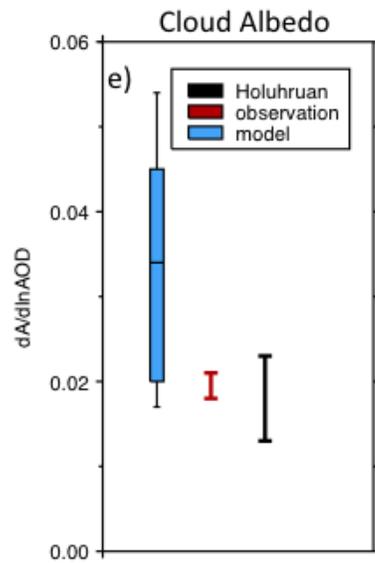
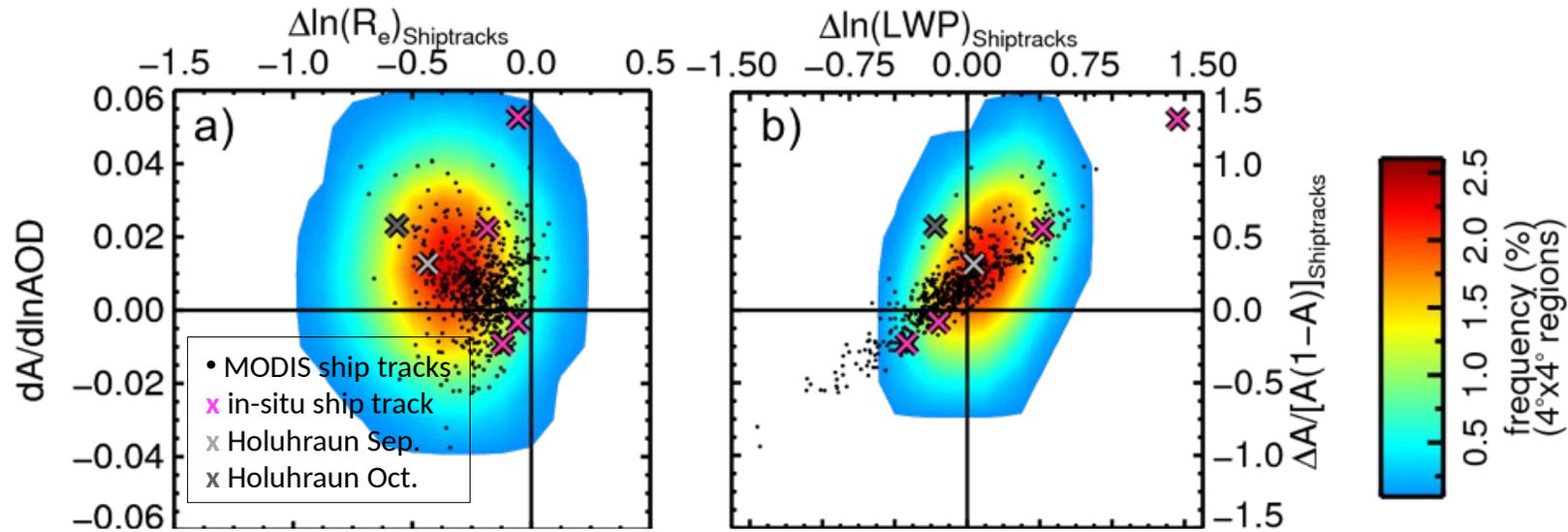


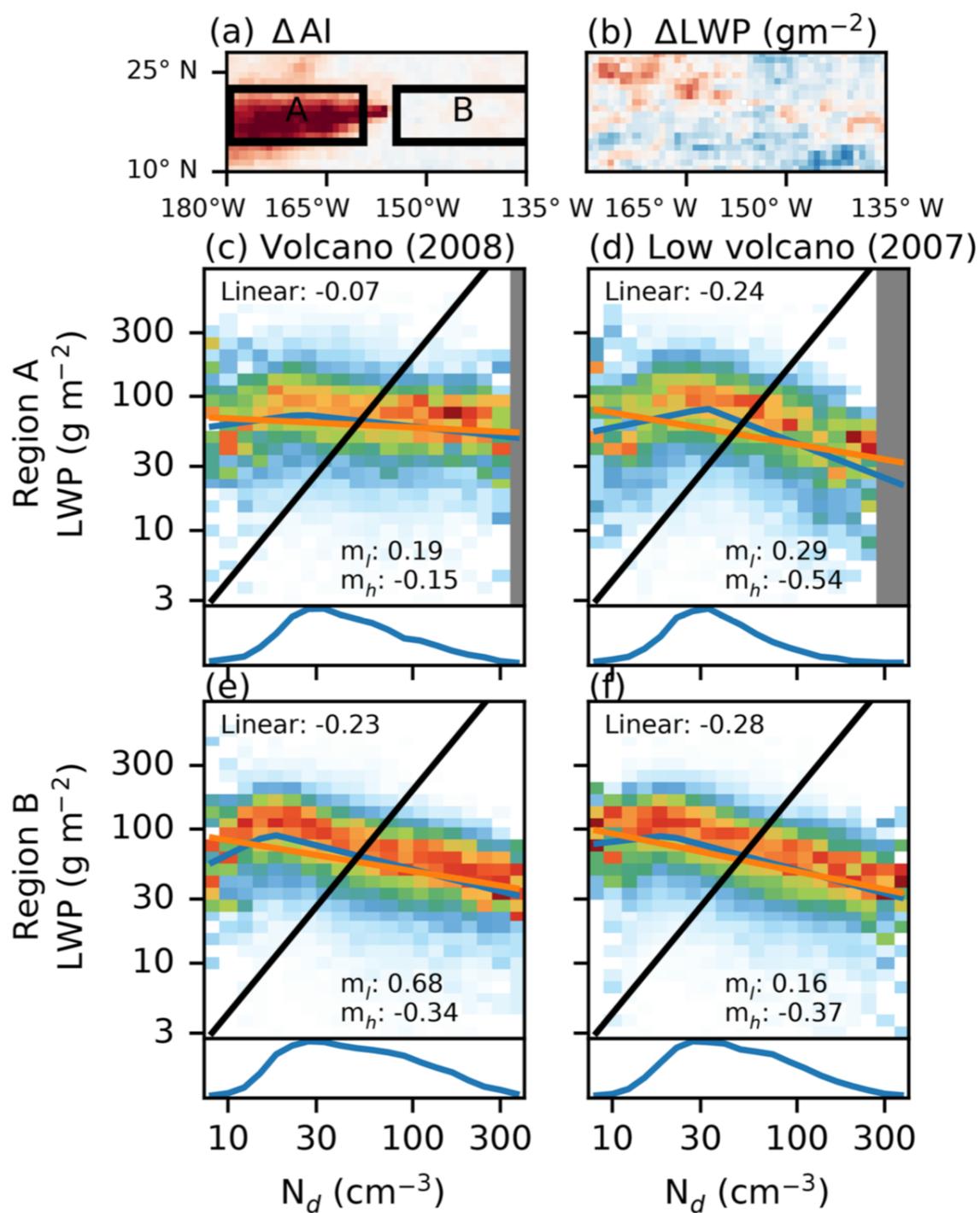
- Albedo calculation: regional-scale (colors) based on CERES – Ship tracks based on MODIS BUGSrad
- Holuhraun eruption data from Malavelle et al. (2017).
- Ship tracks and global-scale A-train observations indicate that cloud albedo is strongly influenced by *macrophysical* (LWP) changes associated with increased aerosol loading.

Cloud Albedo Comparisons

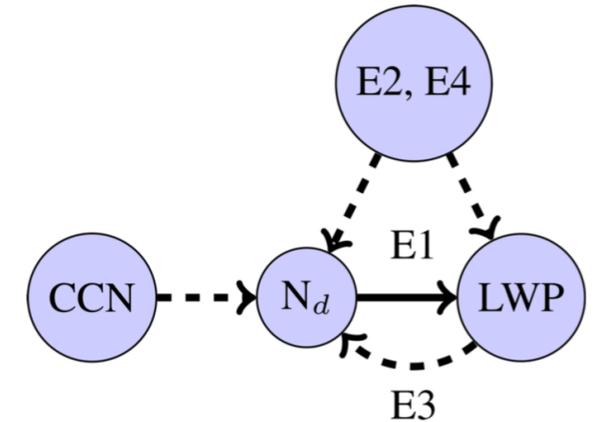


Cloud Albedo Comparisons





Feedback, Confounder or Satellite Retrieval Error?



- LWP vs CDNC relationship “flattens” when the emission rates increase.

Future Satellite Missions

- Plankton, Aerosols, Clouds, ocean Ecosystems (PACE) mission (2022)
 - I. Ocean Color Instrument (hyperspectral radiometer 350 – 885 nm).
 - II. Spectro-Polarimeter for Planetary Exploration-1 (hyperspectral; 100 km narrow swath)
 - III. Hyper Angle Rainbow Polarimeter-2; prism beam splitting (440, 550, 670, and 870 nm; 1500 km broad swath; 2.5 km pixel from 10- 60 different angles)
- Multi-Viewing Multi-Channel Multi-Polarisation Imaging (3MI) (2022)
 - 12 spectral channels, 14 angles, 2200 km swath at 4 km resolution, polarization (-60° , 0° , and $+60^\circ$)
- EarthCare (2012 – 2021??); ACCP
 - I. ATLID – ESA 354.8 nm depolarization lidar
 - II. CPR – -36 dBZ sensitivity, 500 m horizontal and 100 m vertical resolution doppler cloud profile radar
 - III. MSI – 7 channels, 150 km swath, 500 m resolution
 - IV. BBR – broadband radiometer; 10 km resolution
- Meteosat next generation geostationary satellites
 - I. Four Imaging Satellites (MTG-I) (20 years of operational services expected)
 - II. Two Sounding Satellites (MTG-S) (15.5 years of operational services expected)