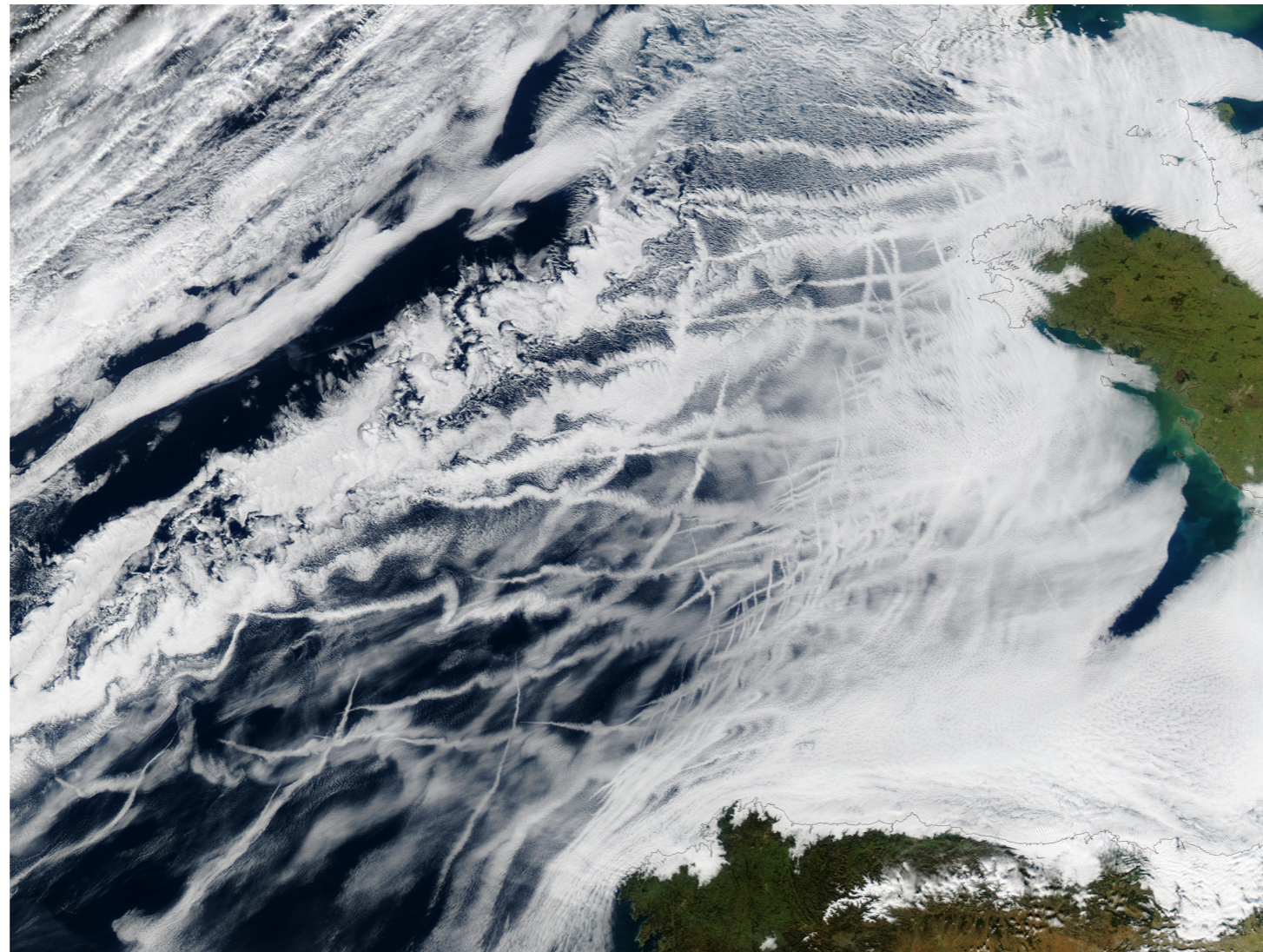


Quantifying aerosol-cloud interactions from satellite observations: opportunities and challenges

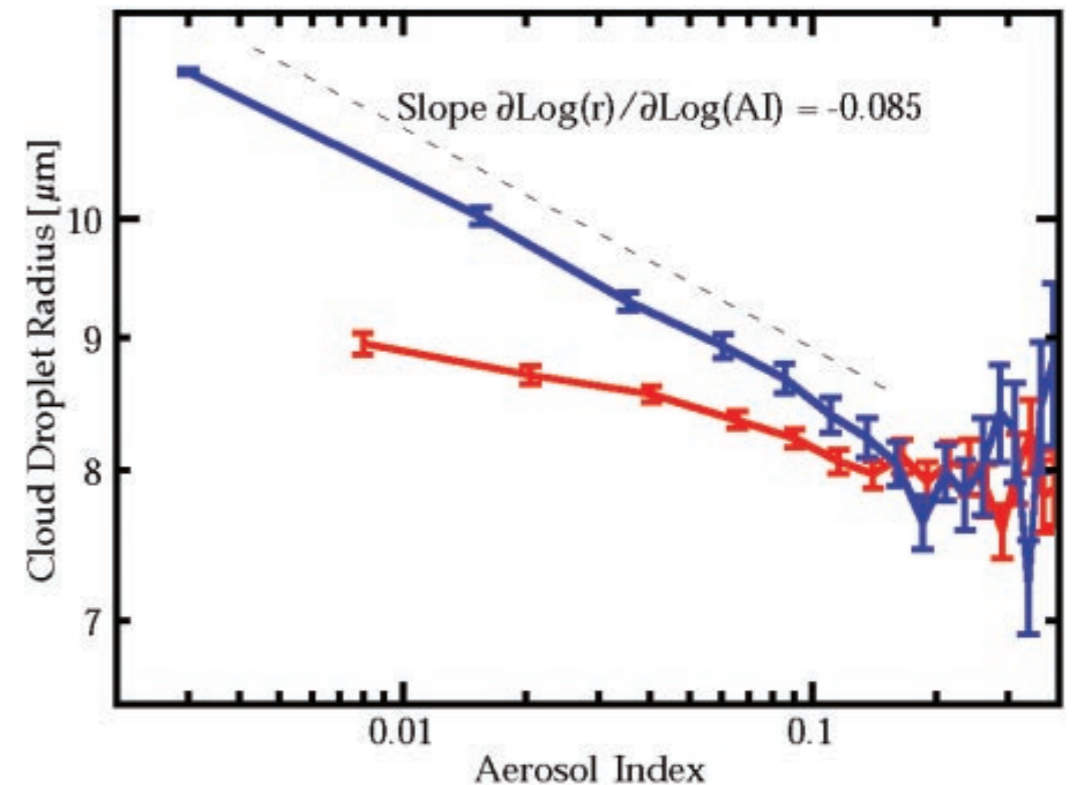
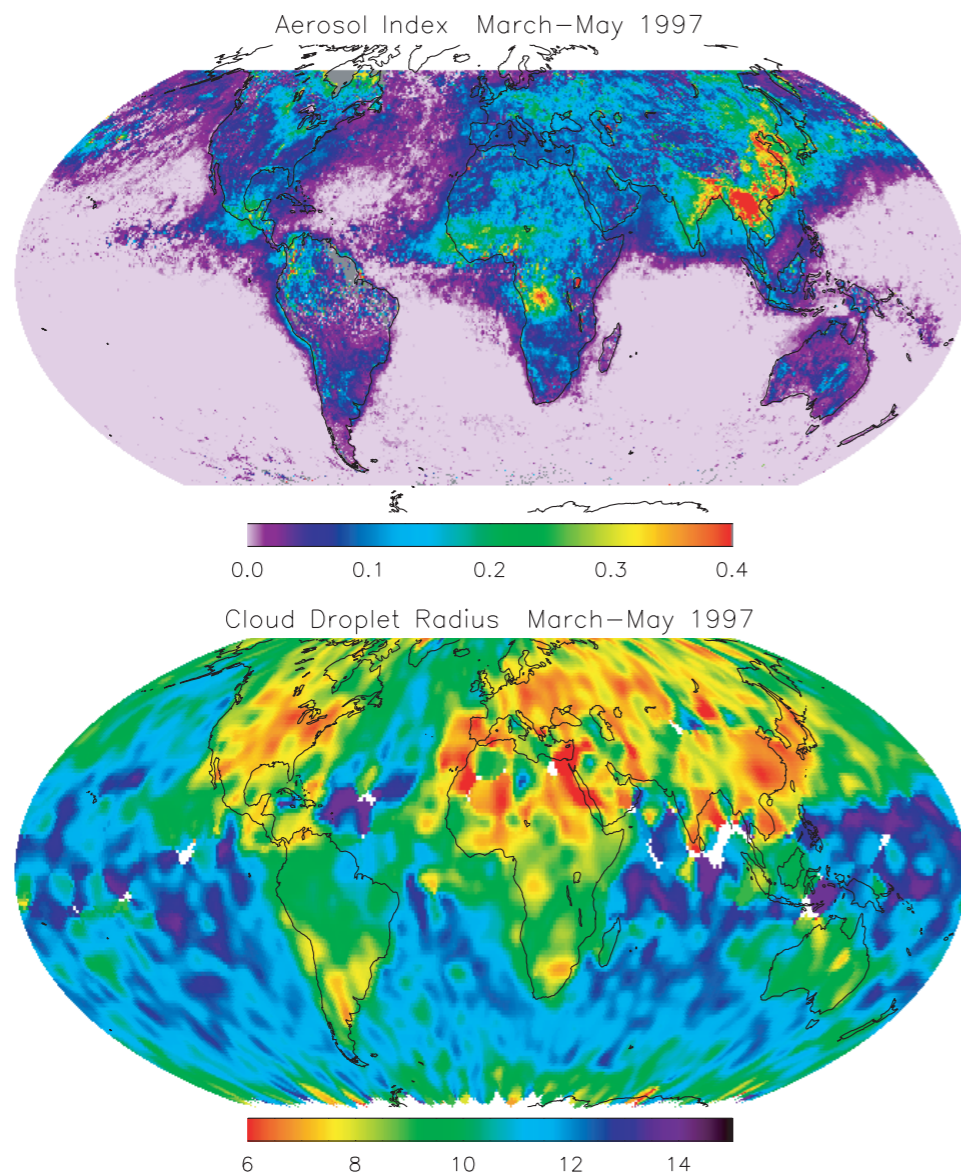


Quantifying the RF_{aci} from satellites

- ▼ Due to their high temporal and spatial coverage, satellite observations are unique tools to study aerosol-cloud interactions (**ACI**).
- ▼ The impact of aerosols on the cloud albedo established by Twomey (1977) has been **quantified** from satellite observations from the past 2 decades.

Quantifying the RF_{aci} from satellites

- ▼ Due to their high temporal and spatial coverage, satellite observations are unique tools to study aerosol-cloud interactions (**ACI**).
- ▼ The impact of aerosols on the cloud albedo established by Twomey (1977) has been **quantified** from satellite observations from the past 2 decades.



Quantifying the RF_{aci} from satellites

- ▼ The question of the **optimal cloud and aerosol properties** to study and quantify ACI from satellite has been long debated.
- ▼ Quantifying the radiative forcing related to aerosol-cloud interactions (RF_{aci}), or Twomey effect, requires a **cloud property** X_{cld} and **aerosol parameter** α .



Quantifying the RF_{aci} from satellites

- ▼ The question of the **optimal cloud and aerosol properties** to study and quantify ACI from satellite has been long debated.
- ▼ Quantifying the radiative forcing related to aerosol-cloud interactions (RF_{aci}), or Twomey effect, requires a **cloud property X_{cld}** and **aerosol parameter α** .



- ▼ This translates to

$$RF_{aci} = \frac{\partial R}{\partial X_{cld}} \frac{\partial X_{cld}}{\partial \alpha} \Delta \alpha$$

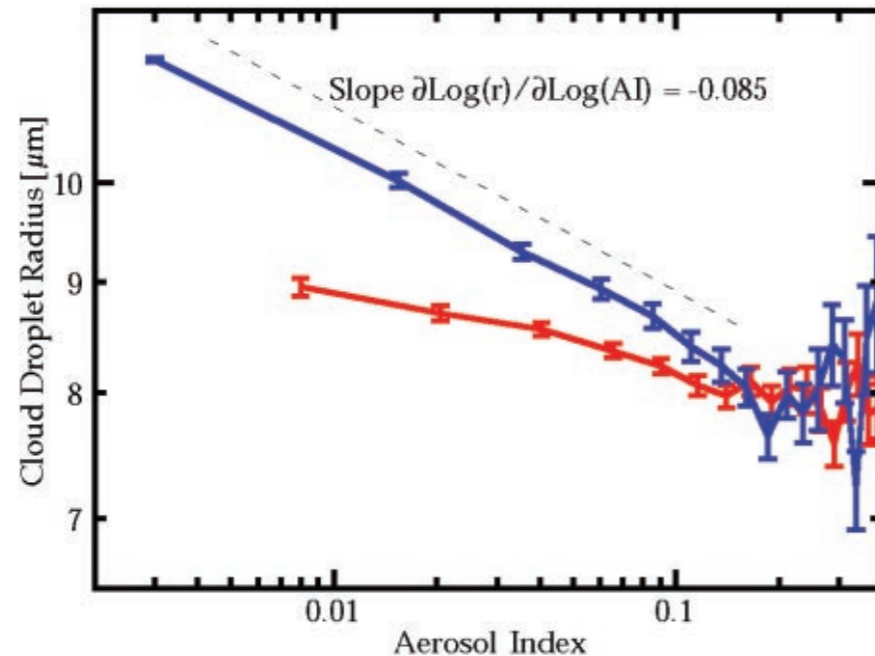
Sensitivity of the cloud property X_{cld} to an aerosol parameter α

Aerosol perturbation (e.g. anthropogenic)

Sensitivity of the net radiative flux R to a cloud property X_{cld} . Obtained from **radiative transfer**.

Quantifying the RF_{aci} from satellites

- ▼ X_{cld} and α should both be obtained from satellite. Early studies used **available** satellite retrievals, such as the droplet effective radius (r_{eff}) and the aerosol optical depth (AOD) or index (AI).



Here, the slope provides directly the sensitivity of the effective radius to AI:

$$RF_{aci} = \frac{\partial R}{\partial r_{eff}} \frac{\partial r_{eff}}{\partial AI} \Delta AI$$

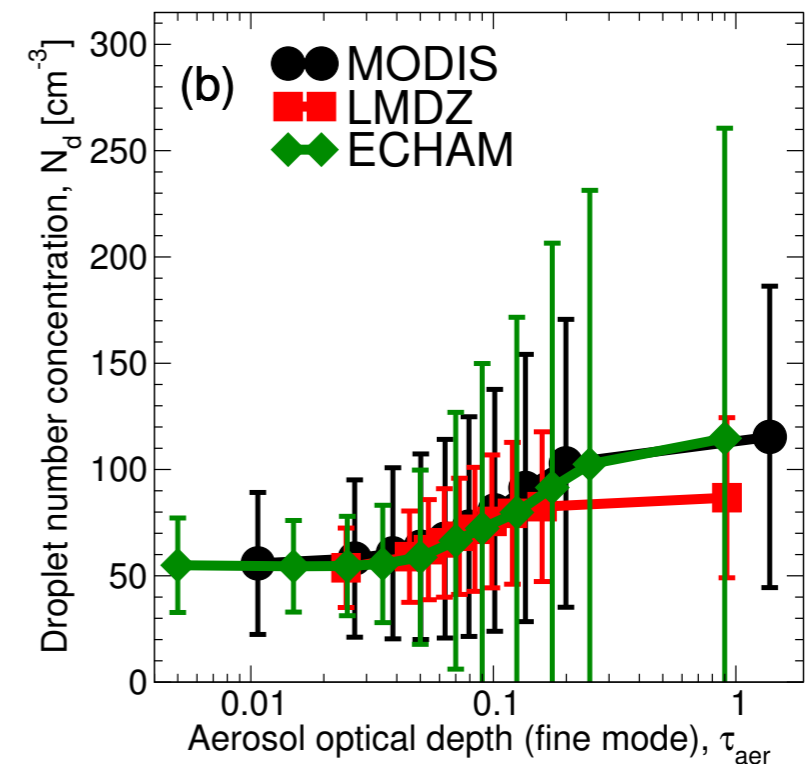
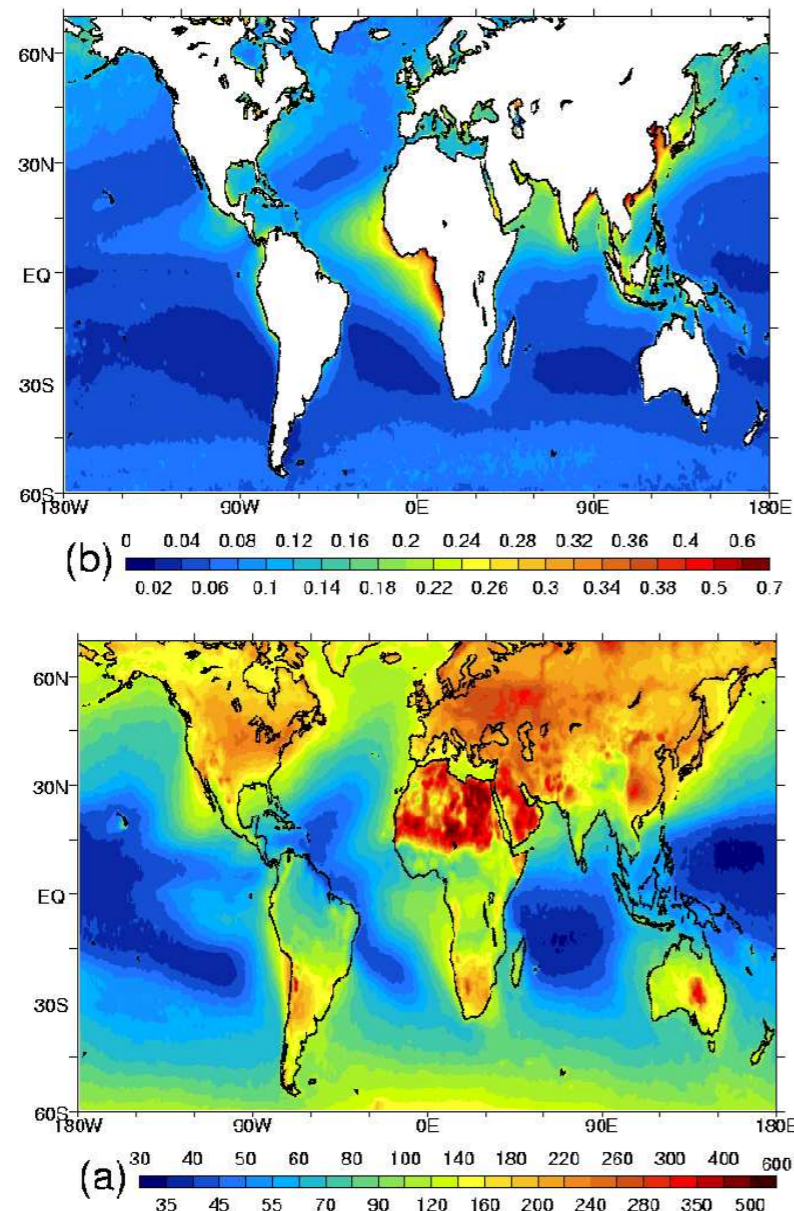
- ▼ These properties were then selected for convenience: they were related to radiative properties but not necessarily to the **cloud formation and growth processes!**

Aerosol and cloud properties for satellite ACI studies

- ▼ The **cloud droplet number concentration** (N_d) is most directly related to nucleation processes and changes in aerosol concentrations.
- ▼ N_d is typically **not available** in operational satellite products. Indirect N_d estimates were still obtained and used to quantify ACI

Aerosol and cloud properties for satellite ACI studies

- ▼ The **cloud droplet number concentration** (N_d) is most directly related to nucleation processes and changes in aerosol concentrations.
- ▼ N_d is typically **not available** in operational satellite products. Indirect N_d estimates were still obtained and used to quantify ACI



(MODIS in black, GCMs in red and green)

Fig. 1. Annual mean (five-year average) (a) cloud droplet number concentration (cm^{-3}) and (b) fine-mode aerosol optical depth (AODFM) as derived from MODIS.

Aerosol and cloud properties for satellite ACI studies

- ▼ This approach to estimate N_d is based on crude assumptions of **adiabatic growth** of droplets and of measurement of r_{eff} at **cloud top** (Brenguier et al, 2000).
- ▼ Under these assumptions, N_d can be related to historically retrieved cloud properties:

$$N_d = \frac{\sqrt{5}}{2\pi k} \left(\frac{f_{\text{ad}} c_w \tau_c}{Q_{\text{ext}} \rho_w r_{\text{eff}}} \right) \approx 1.37 \cdot 10^{-5} \tau_c^{0.5} r_{\text{eff}}^{-2.5}$$

k : shape parameter of the droplet size distribution

c_w : condensation rate

Q_{ext} : extinction coefficient

f_{ad} : adiabatic fraction

τ_c : cloud optical depth (COD)

- ▼ Grosvenor et al (2018; Rev. Geophys.) estimated that **errors** on such N_d retrievals are **at least 50%** for single-layer and homogeneous stratocumulus. They are largely unreliable in other conditions.

Aerosol and cloud properties for satellite ACI studies

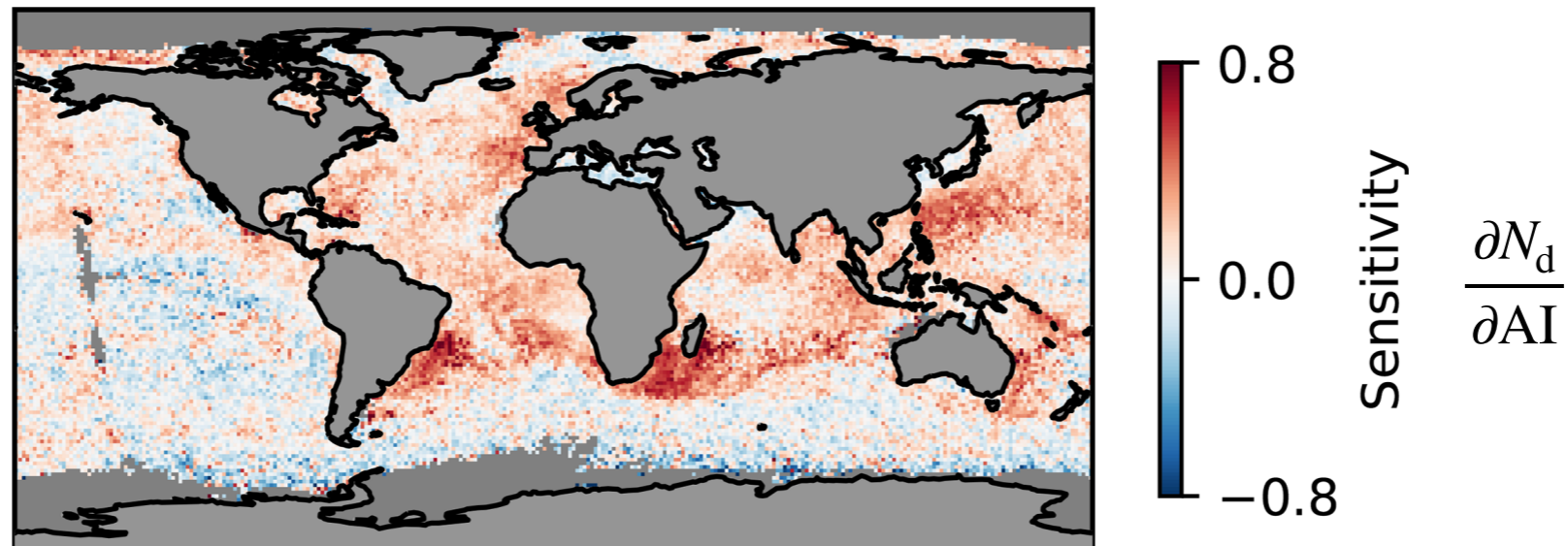
- ▼ The aerosol parameter is also difficult to select. Ideally, it would be the **CCN number concentration**, however unavailable from satellite remote sensing only.
- ▼ Usual alternatives are the **AOD** and the **AI**, both radiative properties:
 - ▼ AI carries information on small particles, making it **well suited** to represent CCN! In widely used products (e.g. MODIS) it is not available over land and considered uncertain over ocean.
 - ▼ AOD is a useful alternative, especially for the fine mode, but remains influenced by the aerosol size.

Aerosol and cloud properties for satellite ACI studies

- ▼ The aerosol parameter is also difficult to select. Ideally, it would be the **CCN number concentration**, however unavailable from satellite remote sensing only.
- ▼ Usual alternatives are the **AOD** and the **AI**, both radiative properties:
 - ▼ AI carries information on small particles, making it **well suited** to represent CCN! In widely used products (e.g. MODIS) it is not available over land and considered uncertain over ocean.
 - ▼ AOD is a useful alternative, especially for the fine mode, but remains influenced by the aerosol size.
- ▼ Remains important issues for both parameters
 - ▼ No information on **speciation** and **hygroscopic growth**
 - ▼ They are **vertically integrated**, CCN are important at cloud-base.
 - ▼ Usually not exactly **co-located** with cloud properties

Aerosol and cloud properties for satellite ACI studies

- ▼ Methods combining satellite-derived N_d estimates with AI or AOD estimates constitute the core of approaches to quantify the RFacI.



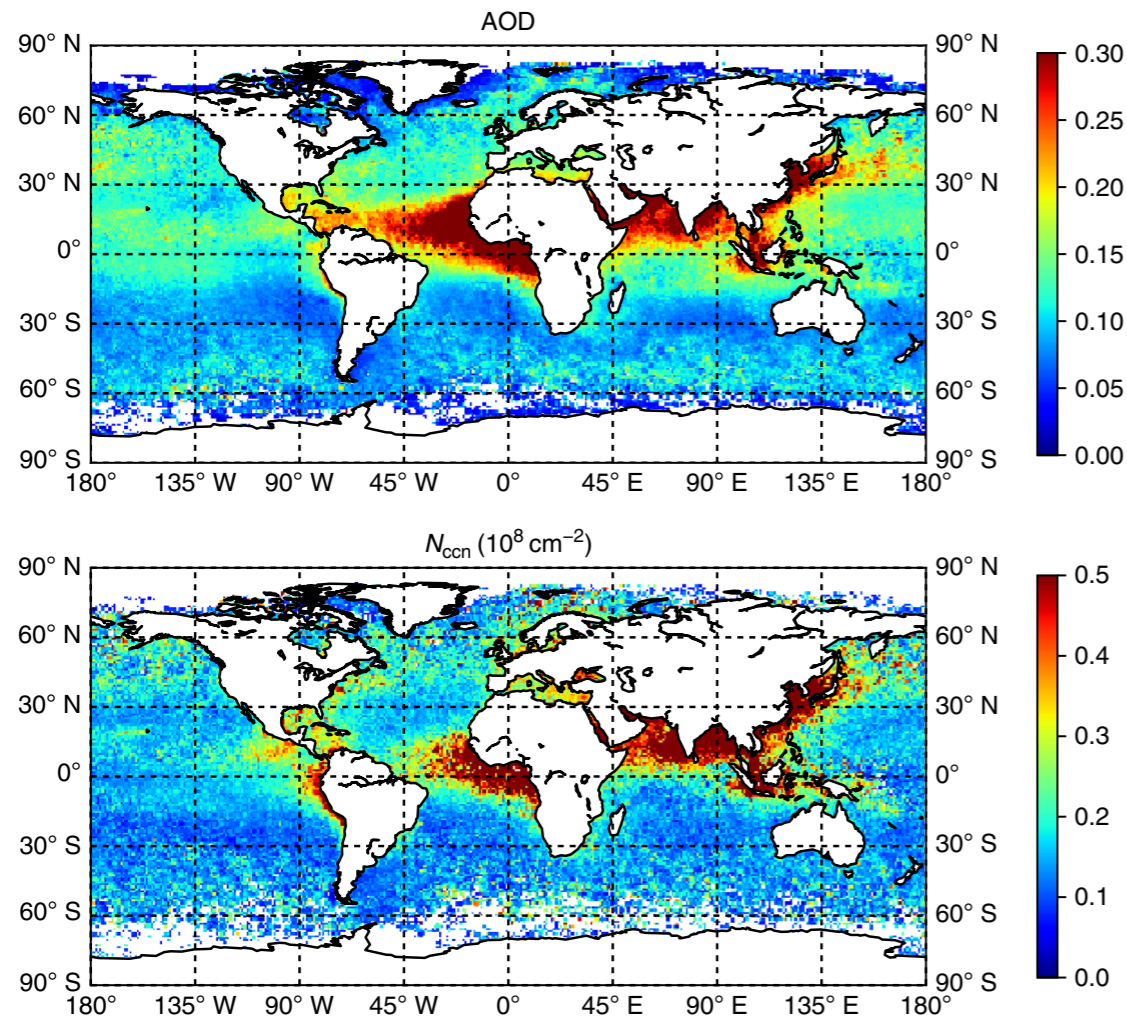
- ▼ Other important issues impacting both cloud and aerosol properties are the **regime dependance** and the **aggregation scale**.
- ▼ Alternative methods are emerging, attempting to tackle these issues.

Aerosol and cloud properties for satellite ACI studies

- ▼ For example, Hasekamp et al (2019) attempted an indirect satellite estimate of a **CCN burden** from polarimetric measurements.
- ▼ This allows for hygroscopicity-corrected R_{Faci} estimates

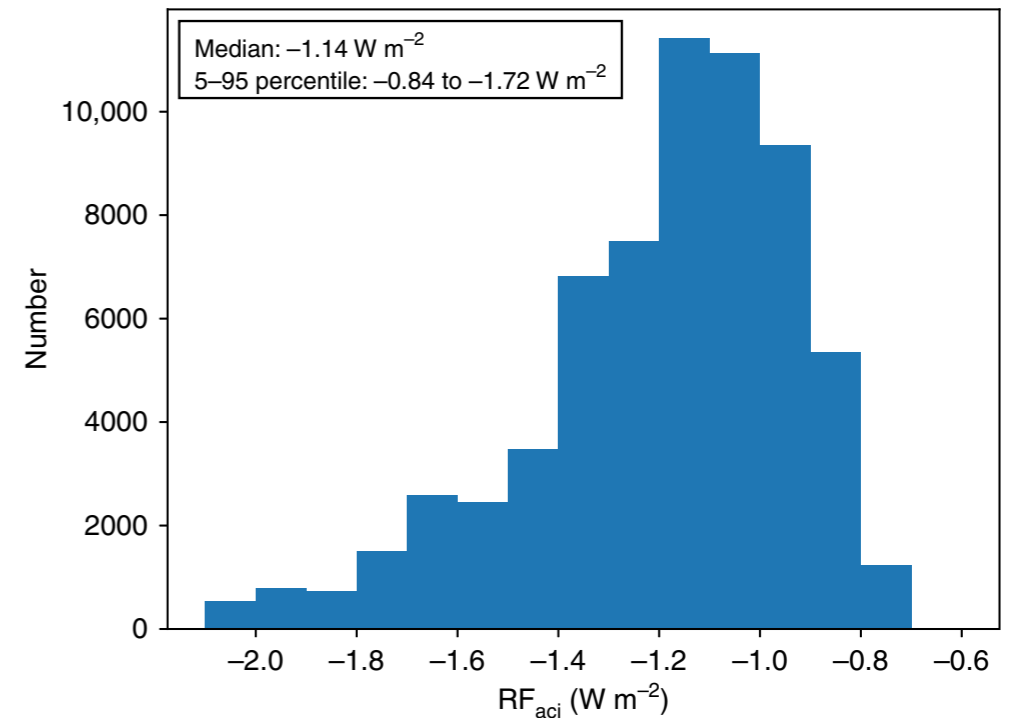
Aerosol and cloud properties for satellite ACI studies

- ▼ For example, Hasekamp et al (2019) attempted an indirect satellite estimate of a **CCN burden** from polarimetric measurements.
- ▼ This allows for hygroscopicity-corrected RF_{aci} estimates



$$\frac{\partial N_d}{\partial N_{CCN}}$$

→



- ▼ They estimated a median RF_{aci} of **-0.33** W m^{-2} from AOD, of **-0.8** W m^{-2} from AI and of **-1.14** W m^{-2} from the CCN-burden!

The ERF_{aci} from satellite observations

- ▼ The RF_{aci} only represent a part of ACI (the better understood one!).
- ▼ **Rapid cloud adjustment** of the LWP, cloud fraction, lifetime, vertical extent and precipitation rate can also appear (among others).
- ▼ Combining adjustments and RF_{aci} leads to the effective radiative forcing, **ERF_{aci}** .

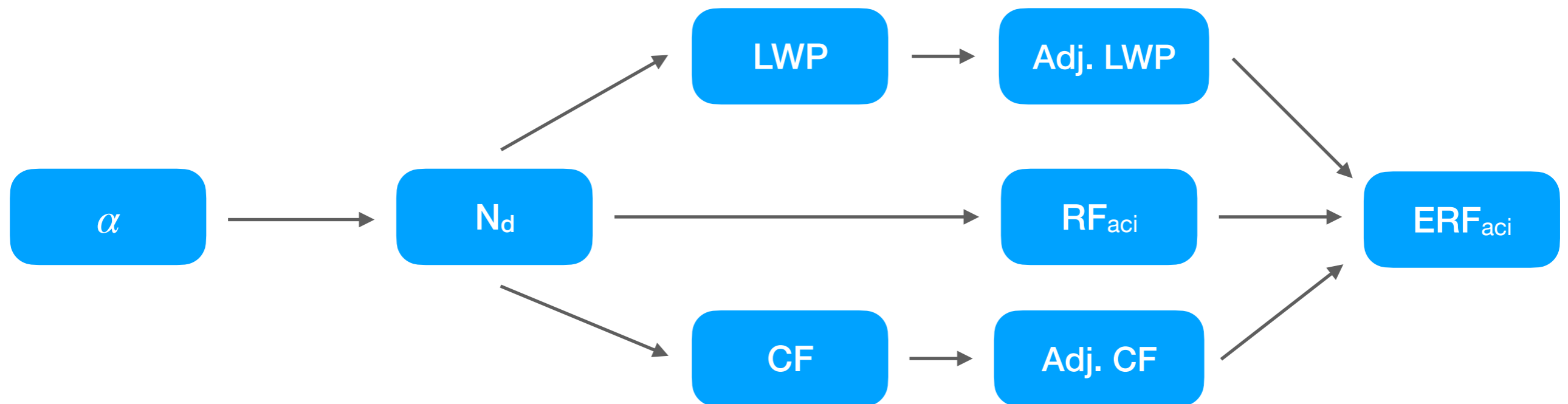
The ERF_{aci} from satellite observations

- ▼ The RF_{aci} only represent a part of ACI (the better understood one!).
- ▼ **Rapid cloud adjustment** of the LWP, cloud fraction, lifetime, vertical extent and precipitation rate can also appear (among others).
- ▼ Combining adjustments and RF_{aci} leads to the effective radiative forcing, **ERF_{aci}** .
- ▼ For instance, including adjustments to LWP and CF:



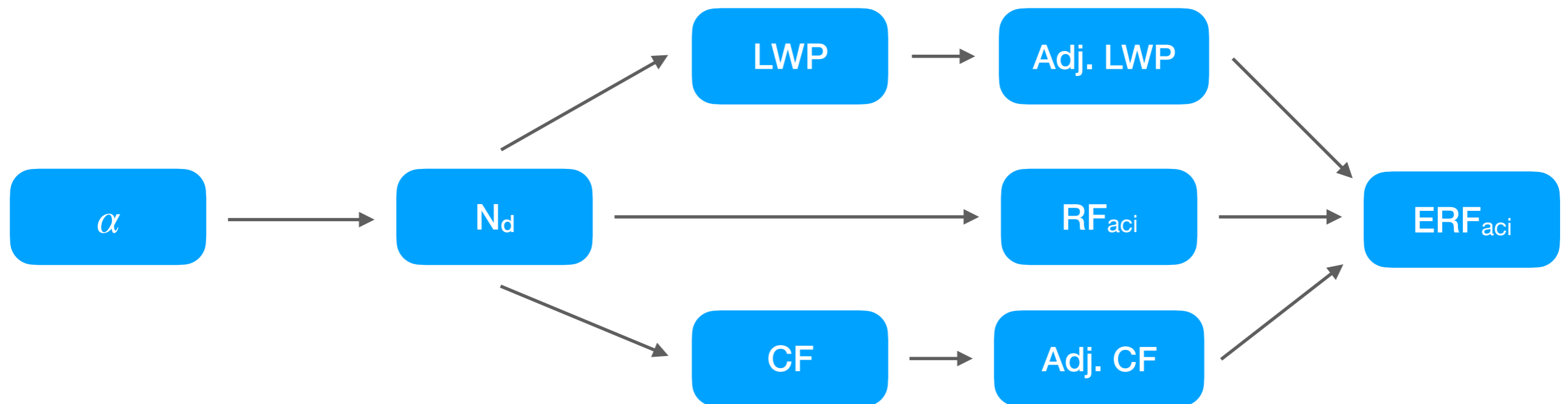
The ERF_{aci} from satellite observations

- ▼ The RF_{aci} only represent a part of ACI (the better understood one!).
- ▼ **Rapid cloud adjustment** of the LWP, cloud fraction, lifetime, vertical extent and precipitation rate can also appear (among others).
- ▼ Combining adjustments and RF_{aci} leads to the effective radiative forcing, **ERF_{aci}** .
- ▼ For instance, including adjustments to LWP and CF:



The ERF_{aci} from satellite observations

- ▼ The RF_{aci} only represent a part of ACI (the better understood one!).
- ▼ **Rapid cloud adjustment** of the LWP, cloud fraction, lifetime, vertical extent and precipitation rate can also appear (among others).
- ▼ Combining adjustments and RF_{aci} leads to the effective radiative forcing, **ERF_{aci}** .
- ▼ For instance, including adjustments to LWP and CF:



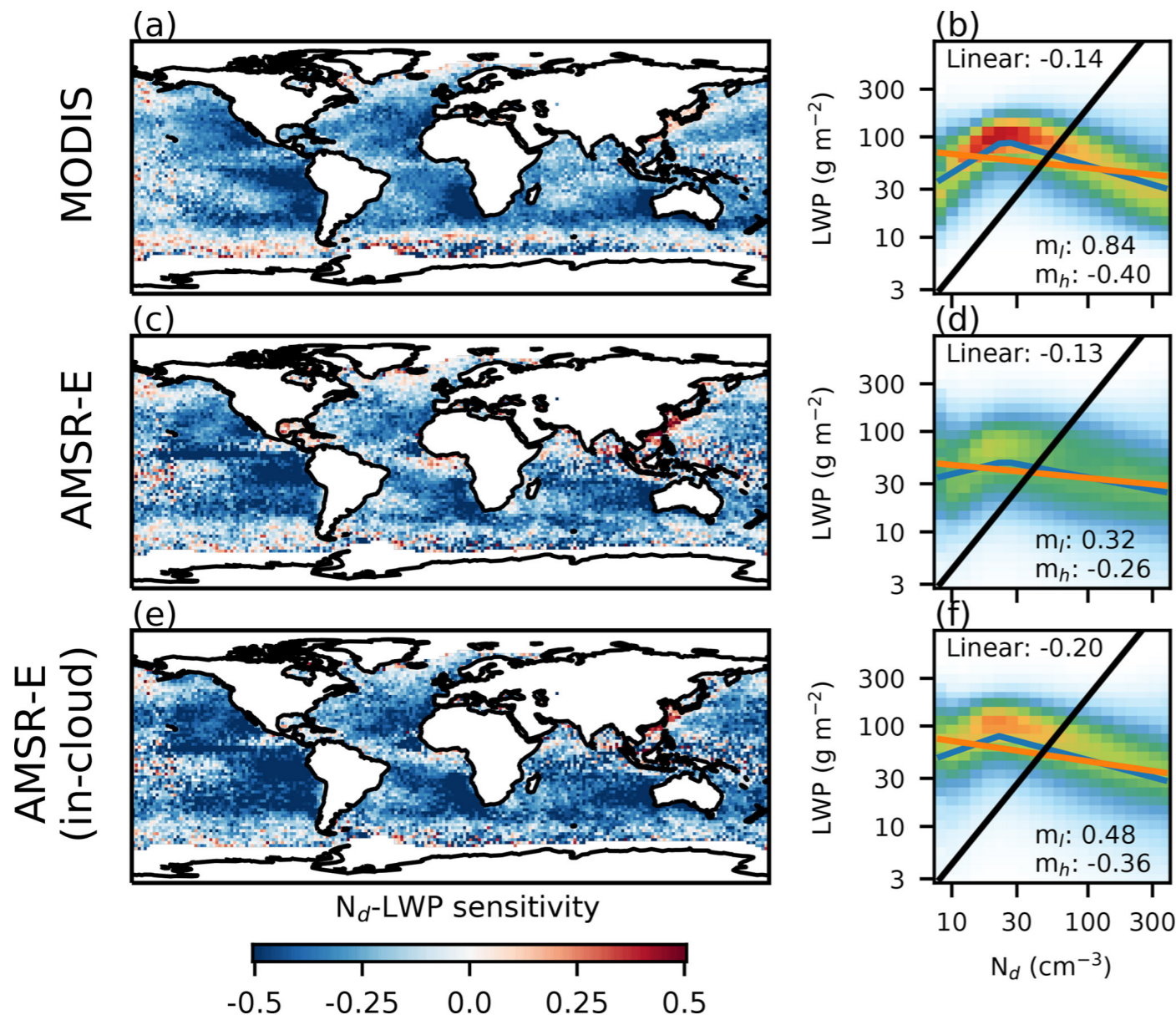
$$ERF_{aci} = \left[\left(\frac{\partial R}{\partial N_d} \right)_{LWP,CF} + \frac{\partial R}{\partial LWP} \frac{\partial LWP}{\partial N_d} + \frac{\partial R}{\partial CF} \frac{\partial CF}{\partial N_d} \right] \frac{\partial N_d}{\partial \alpha} \Delta \alpha$$

The ERF_{aci} from satellite observations

- ▼ Adjustments are difficult to quantify using satellites because retrievals are **highly correlated** to each other and **confounding factors** are difficult to isolate.

The ERF_{aci} from satellite observations

- ▼ Adjustments are difficult to quantify using satellites because retrievals are **highly correlated** to each other and **confounding factors** are difficult to isolate.
- ▼ LWP adjustments are still expected to be significant, as shown by Gryspeerdt et al:



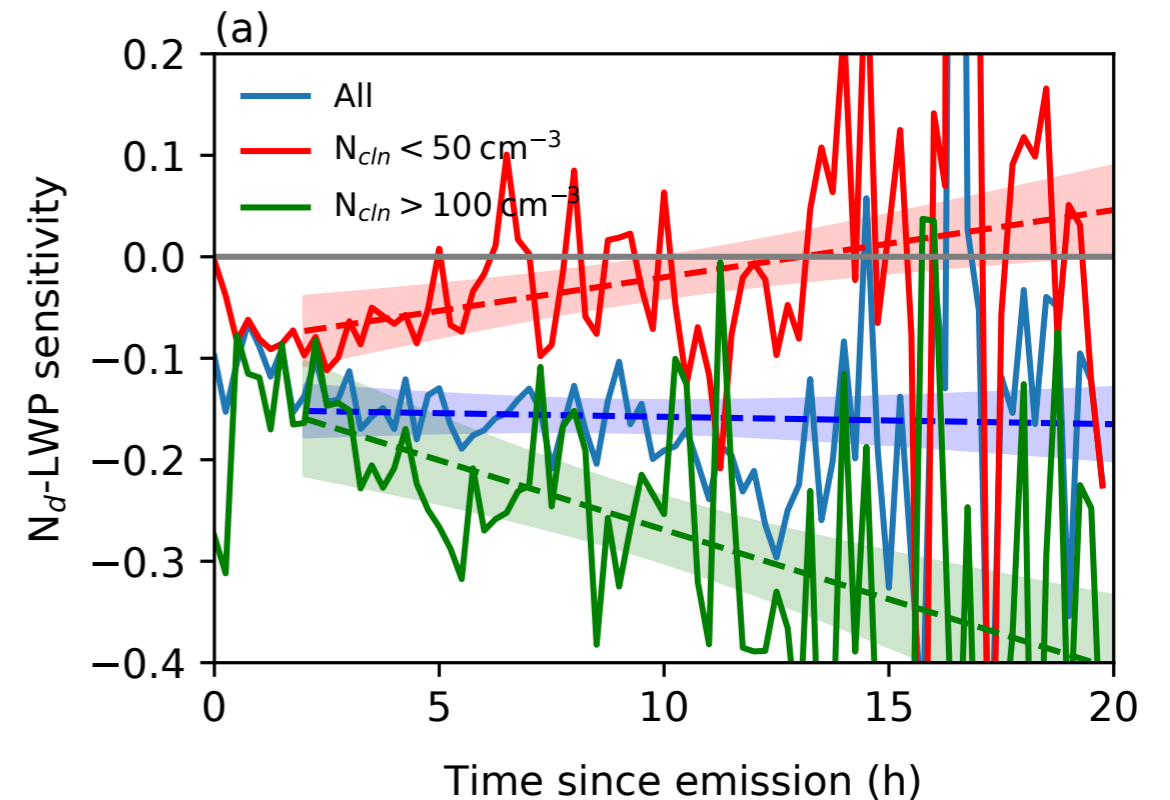
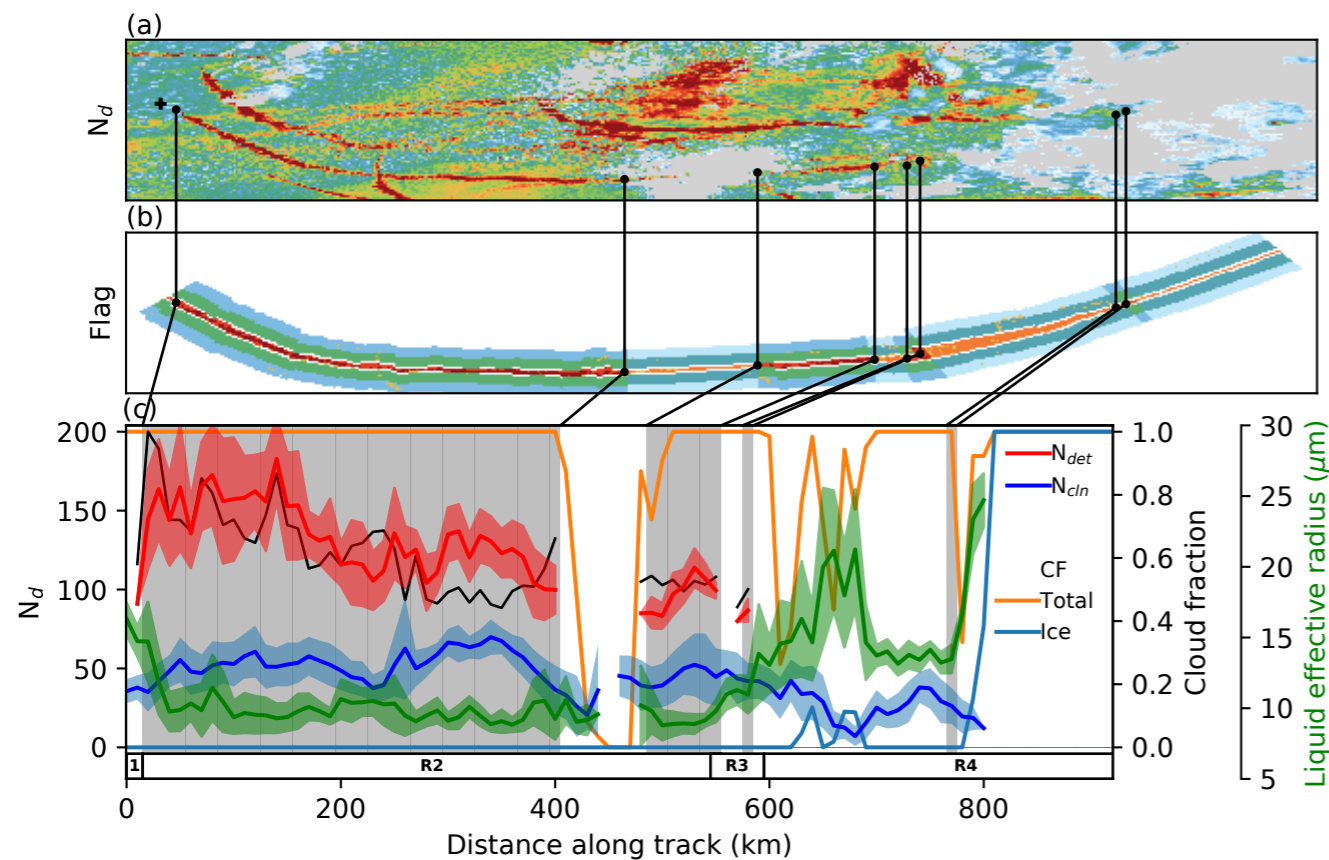
- ▼ Global negative N_d -LWP relationship.
- ▼ Positive relationship for small N_d , consistent with precipitation suppression and cloud invigoration.
- ▼ The N_d -LWP relation appears weaker on natural experiments, setting a bound to the adjustments.
- ▼ LWP adjustments can offset the R_{Faci} by **60%**.
- ▼ **Still very uncertain!**

Natural experiments to the rescue

- ▼ Natural experiments are becoming increasingly useful to provide a controlled setup to better understand cloud adjustments.

Natural experiments to the rescue

- ▼ Natural experiments are becoming increasingly useful to provide a controlled setup to better understand cloud adjustments.
- ▼ For instance, following the previous analysis, **ship tracks** can be used to quantify the time scale of LWP adjustments



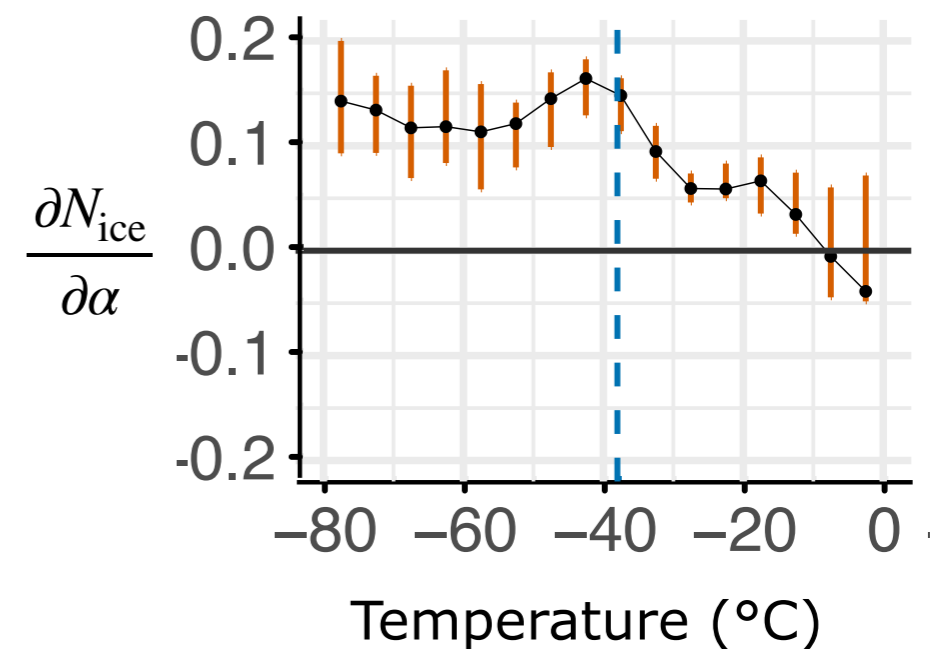
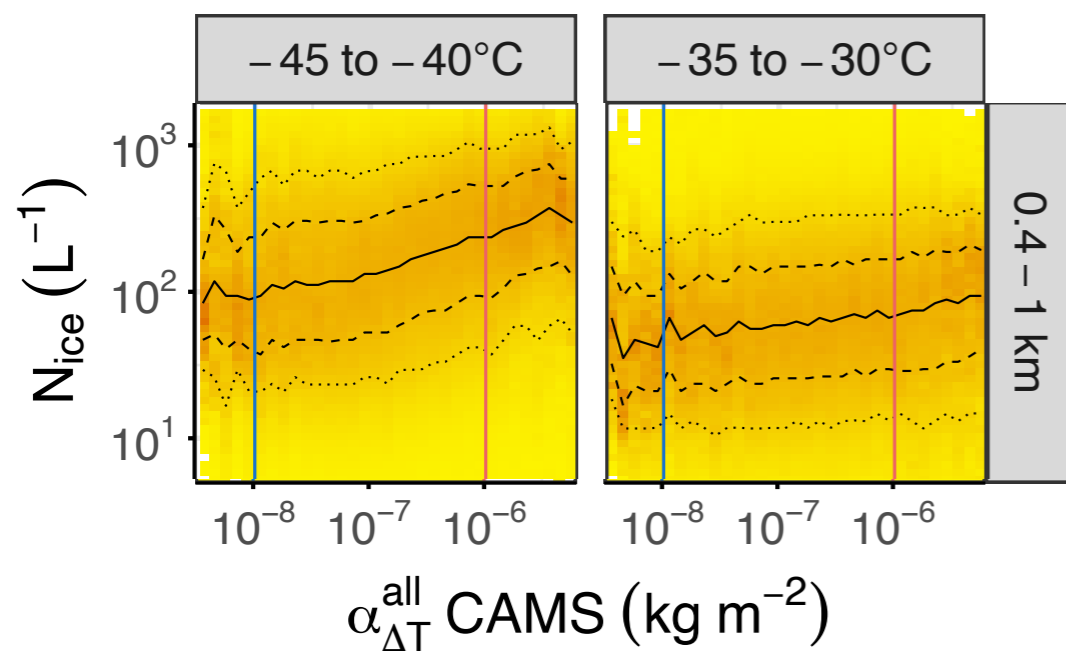
- ▼ This studies demonstrates, using natural experiments, the importance of considering **time scales** when accounting for ACI.

The challenge of ice and mixed-phase clouds

- ▼ A strong emphasis in ACI studies from satellite observation is put on **liquid clouds!**
- ▼ The ERF_{aci} associated with **ice** and **mixed-phase** clouds remains largely **unknown**, largely due to a lack of adapted cloud properties.

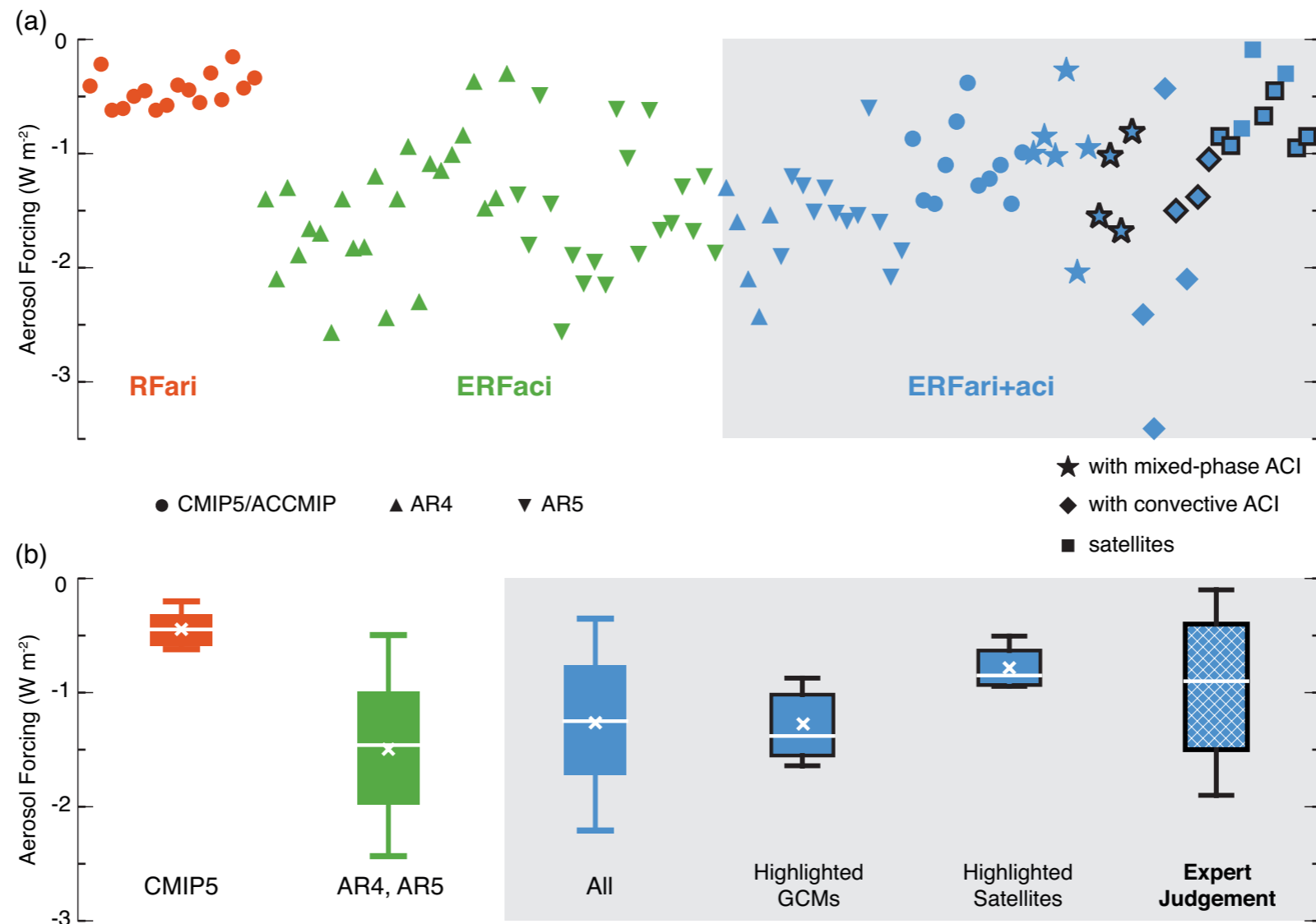
The challenge of ice and mixed-phase clouds

- ▼ A strong emphasis in ACI studies from satellite observation is put on **liquid clouds!**
- ▼ The ERF_{aci} associated with **ice** and **mixed-phase** clouds remains largely **unknown**, largely due to a lack of adapted cloud properties.
- ▼ However, emergent methods to retrieve e.g. the **ice crystal number concentration** from satellite observations start allowing for similar studies!



Inconsistencies between observations and modelling

- ▼ ERF_{aci} estimates remain largely **inconsistent** between satellite observations and modelling.



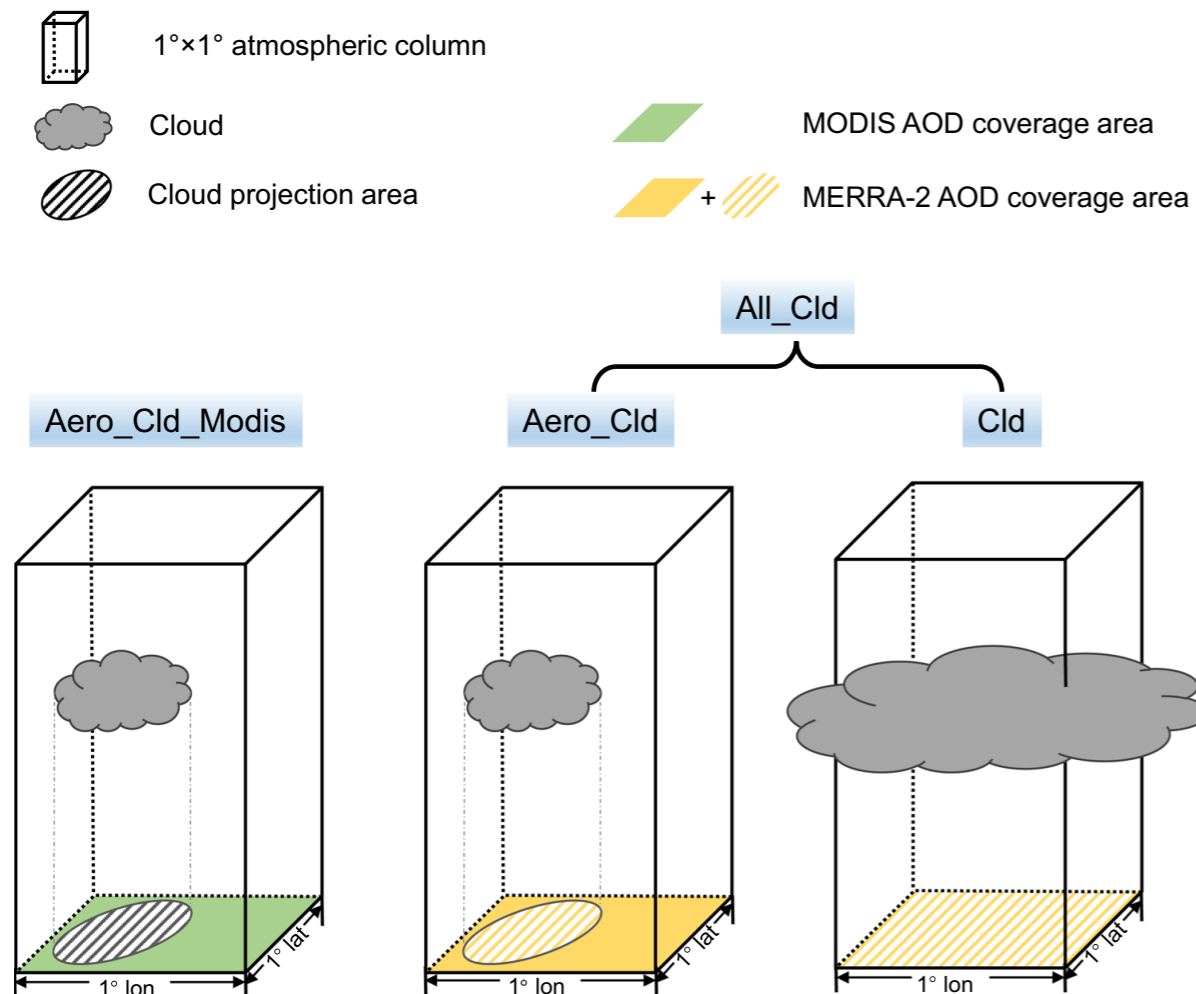
- ▼ It is not yet clear if satellites provide better estimations, considering the high attached uncertainties and difficulties to assess adjustments.

Inconsistencies between observations and modelling

- ▼ There are attempts to reconcile modelling and satellite values of ERFaci, especially by making their **computation** more similar (e.g. Gryspeerdt et al, 2020b; ACP)
- ▼ Other studies show **inherent limitations** to current purely satellite approaches, such as the coincidence between aerosol and cloud properties.

Inconsistencies between observations and modelling

- ▼ There are attempts to reconcile modelling and satellite values of ERFaci, especially by making their **computation** more similar (e.g. Gryspeerd et al, 2020b; ACP)
- ▼ Other studies show **inherent limitations** to current purely satellite approaches, such as the coincidence between aerosol and cloud properties.



- ▼ Xia et al (2021) quantified the bias in RFaci due to sampling, by reproducing it in reanalyses data.
- ▼ They find that missed clouds typically exert a strong cooling effect
- ▼ Accounting for this bias, **RFaci increases by 55%**, making it more compatible with modelling estimates

Summary

- ▼ R_{Faci} usually estimated from satellite using the cloud **droplet number concentration** and either the **aerosol optical depth** or **index**
- ▼ Large **uncertainties on N_d** still exist and urgently need to be reduced
- ▼ **Aerosol retrievals** are uncertain, not always adapted (hygroscopicity issue) and can be difficult to use co-jointly because of co-location problems.
- ▼ **Adjustments** are difficult to quantify using satellite observations only but progress has been made, especially using natural laboratories
- ▼ Not enough study on the ACI associated with **ice** and **mixed-phase** clouds
- ▼ **Observations and modelling** ERF_{aci} estimates remain largely inconsistent. We need to work towards unified and more robust methods to quantify ACI.