# Radar-based ice number concentration retrievals towards studying secondary ice production in mixed-phase clouds

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# Pristine ice number concentration is often orders of magnitude larger than what is expected

 This phenomenon, known as secondary ice production, can rapidly impact cloud evolution

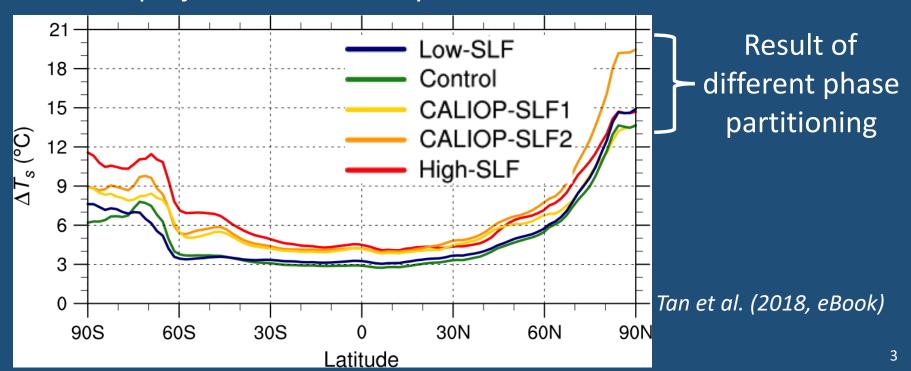
 Its representation remains challenging due to limited observational constraints

 Strong need for long-term, robust observations of pristine ice to better identify these events and their trigger mechanisms



# Clouds are particularly sensitive to changes in ice microphysical processes

- Phase partitioning modulates radiative properties, precipitation production, and cloud lifetime
- Phase transitions poorly captured in models ramifications for climate projection uncertainty



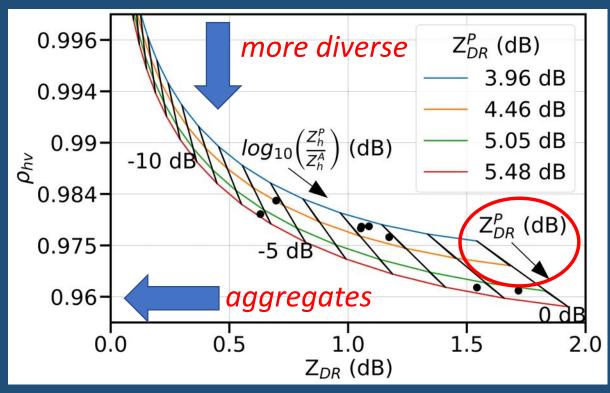


# Separating pristine ice from aggregates is a key remote sensing hurdle

4 observables from polarimetric radar:

- Reflectivity (Z<sub>H</sub>)
- Differential reflectivity (Z<sub>DR</sub>)
- Co-polar correlation coefficient  $(\rho_{hv})$
- Specific differential
   phase shift (K<sub>DP</sub>)

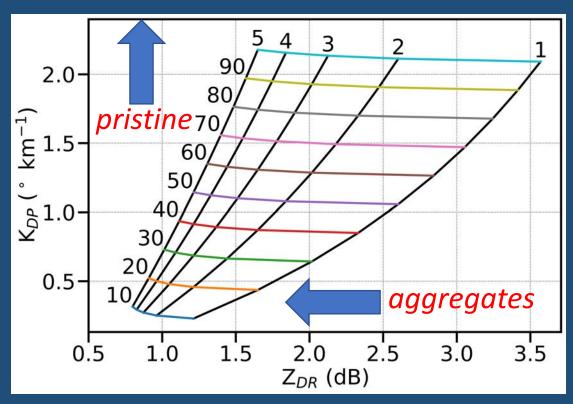
Scattering models - 3 pristine ice habits and 5 aggregate types (Lu et al. 2015)



Similar to Keat and Westbrook (2017, JGR)



# K<sub>DP</sub> dominated by pristine ice, revealing their sizes and abundance even in the presence of aggregates



Similar to Schrom and Kumjian (2015, JAMC)

- Use an iterative
   ensemble method to
   provide # concentration
   and size for both
   pristine/aggregates
- Radar data corrected for attenuation and systematic bias/noise, smoothing applied (Chandrasekar group)



### ENCORE-ICE uses the iterative Ensemble Kalman Filter to find the best estimate of the state vector

$$x_{i+1} = x_i + K(y - h(x_i)) - (1 - KH)(x_i - x_b)$$

updated current state state obs. forward model and its linearization its linearization state

#### Kalman Gain

controls how much weight is placed on the observations, compared to the current state



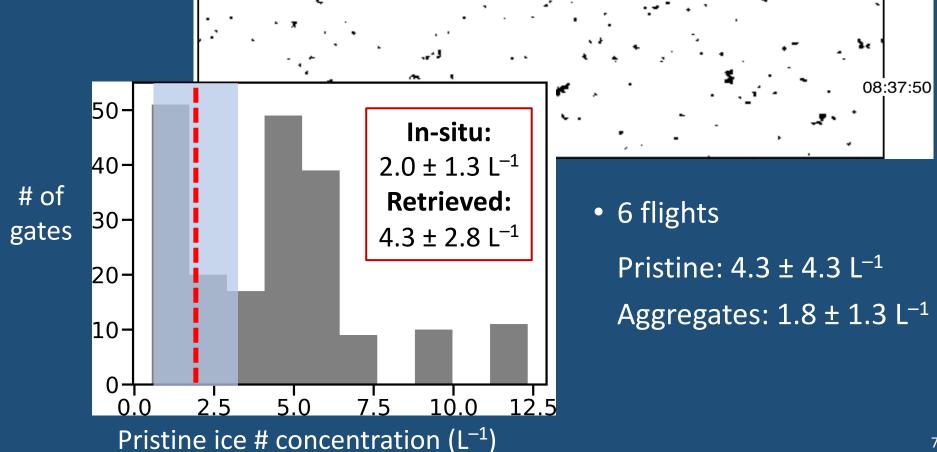
can be directly calculated

Method allows for full uncertainty estimation



### Evaluations against in-situ cloud measurements

 Using data from the UK PICASSO campaign (Parameterizing ice) clouds using airborne observations and triple-frequency Doppler radar data)





### ARM Mobile Facility deployment in Finland

 Biogenic Aerosols – Effects on Clouds and Climate (BAECC) in 2014

 Particularly interested in along-wind scans from X-band radar to follow microphysical processes in a Lagrangian sense

 Comprehensive aerosol measurements to compute primary ice # concentration from Demott et al. (2010)

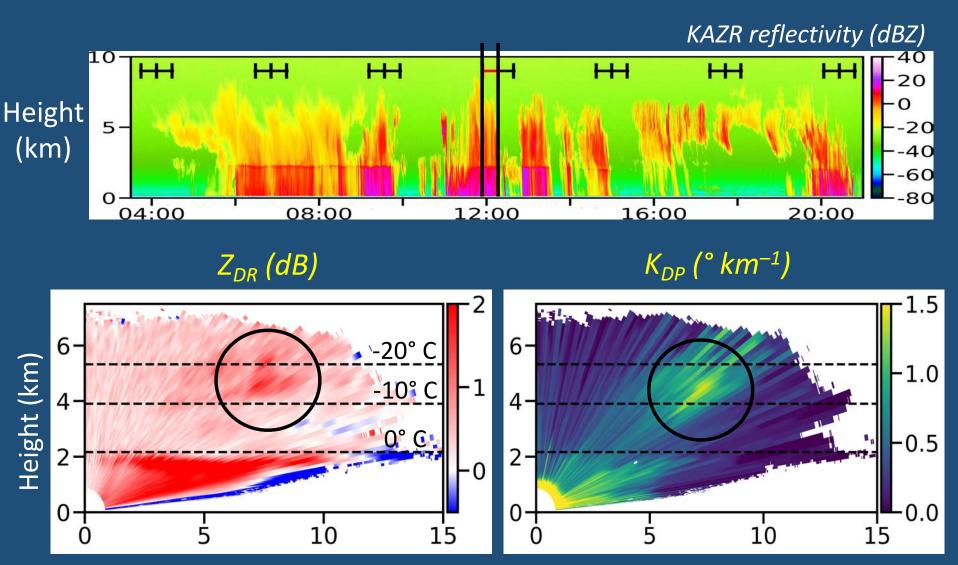




Petäjä et al. (2016, BAMS)



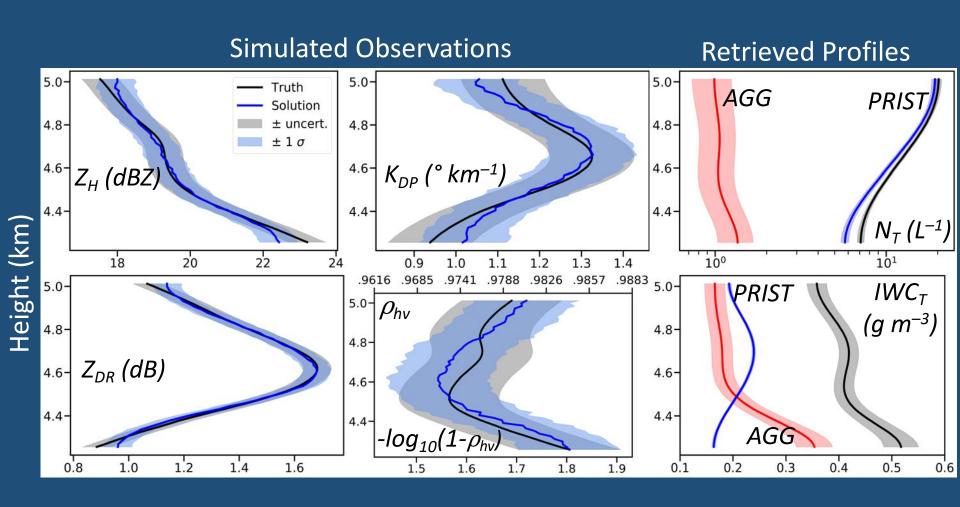
### A stratiform cloud case on 18–19 August 2014



Distance from radar (km)



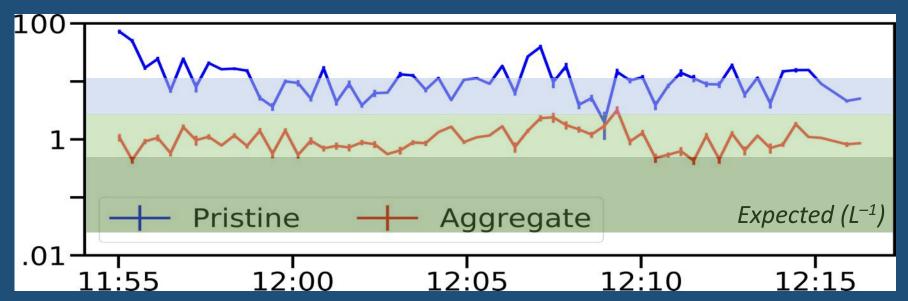
### ENCORE-ICE exhibits skill in matching polarimetric observations





#### Time evolution of ice number concentration

Ice Number Concentration ( $L^{-1}$ ) in a zone between -5 and  $-20^{\circ}$ C



#### This scan period:

Pristine:  $12.7 \pm 1.1 L^{-1}$ 

Aggregate:  $1.0 \pm 0.1 L^{-1}$ 

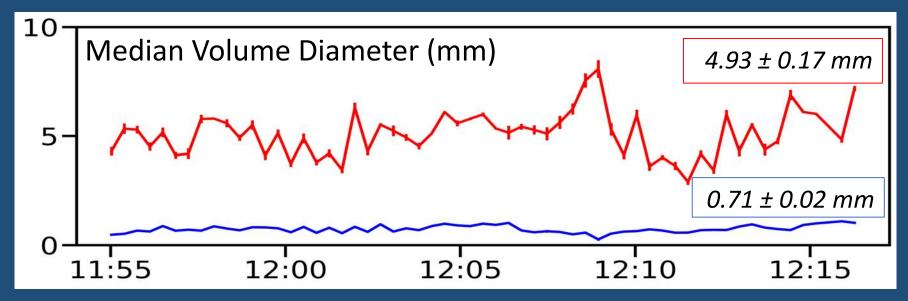
#### **PICASSO**

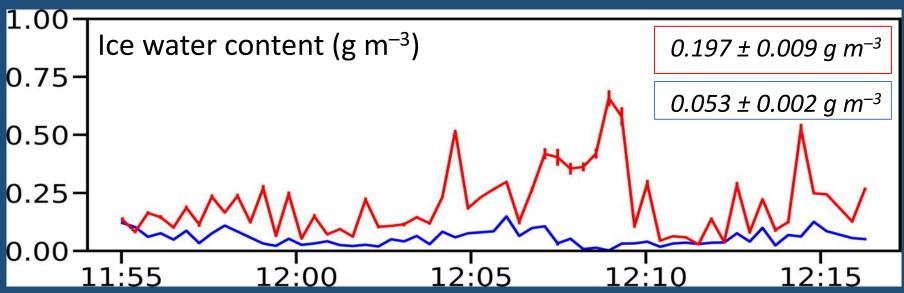
Pristine:  $4.3 \pm 4.3 L^{-1}$ 

Aggregate: 1.8 ± 1.3 L<sup>-1</sup>



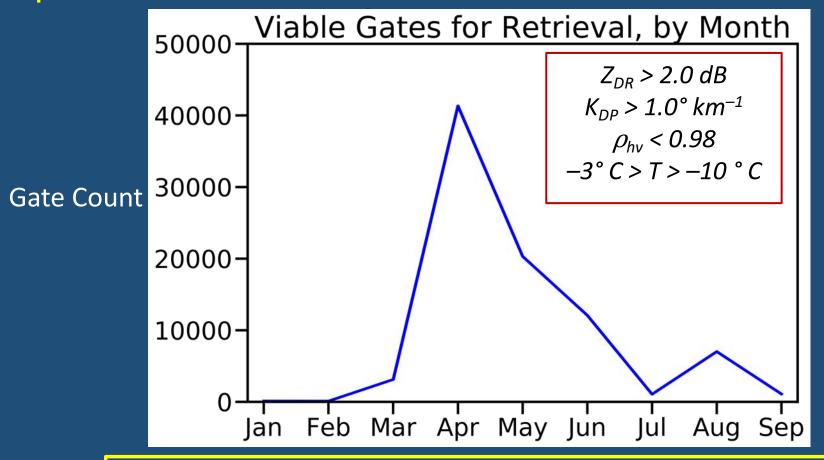
### Pristine/aggregate microphysical properties







# Towards robust characterization of secondary ice production events



Rich amount of data with strong polarimetric signal in favorable temperature regimes



### Summary

- We retrieve pristine ice and aggregate number concentrations simultaneously using polarimetric scanning cloud radar data, showing good agreement with in-situ data
- In the temperature region that secondary ice production likely occurs (e.g., about –8 to –10°C), the retrieved pristine ice number concentration is about an order of magnitude larger than primary ice number concentration
- While the enhancement in ice number is not as large as expected, some multiplication processes may be present and warrant further analysis



#### Literature

Demott, P. J., A. J. Prenni, X. Liu, S. M. Kreidenweis, M. D. Petters, C. H. Twohy, M. S. Richardson, T. Eidhammer, and D. C. Rogers (2010), Predicting global atmospheric ice nuclei distributions and their impacts on climate, Proceedings of the National Academy of Sciences, 107(25), 11217–11222, doi:10.1073/pnas.0910818107.

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