



June 20-22, 2023  
Vienna, Austria

# International Conference on Icing

of Aircraft, Engines,  
and Structures

[sae.org/icing](http://sae.org/icing)





# SENS4ICE

SENSORS AND CERTIFIABLE HYBRID ARCHITECTURES  
FOR SAFER AVIATION IN ICING ENVIRONMENT

**Overview of cloud microphysical measurements during the SENS4ICE  
airborne test campaigns:  
contrasting icing frequencies from climatological data  
to first results from airborne observations**

SAE International Conference on Icing

Tina Jurkat-Witschas (DLR)

ET AL

20-22 June 2023

This project has received funding from European Union's Horizon 2020 research and innovation programme under grant agreement n° 824253



# ET AL – „no (wo)man is an island“



... Johannes Lucke, Carsten Schwarz, Christoph Deiler, Falk Sachs, Deniz Menekay, Simon Kirschler, Johanna Mayer, Christiane Voigt - Deutsches Zentrum für Luft- und Raumfahrt

Alessandra Zollo - CIRA

Frank Kalinka – Deutscher Wetterdienst

Emilia Sanchez, Christian Pagé - CERFACS

Olivier Jaron and Benoit Vie – Météo France

Aurelien Bourdon and the SAFIRE crew- SAFIRE

Ben Bernstein – Leading Edge Atmosphere

Daniel Da Silva Martin, Luiz Antonio Algodual Vieira, Carlos Roberto Hardt Lucia Silveira, Rogerio Pereira De Lima - EMB

Lyle Lilie and Dan Bouley - Science Engineering Associates SEA

and the SENS4ICE team

# Overview

- 💧 Motivation
- 💧 Assessment of Climatological Means of Icing Conditions for targeted time and altitude of the SENS4ICE campaigns
- 💧 Overview on microphysical reference instrumentation
- 💧 First preliminary data of icing conditions during the SENS4ICE US campaign and the SENS4ICE EU Campaign



# Motivation

- **Validation of new sensor technologies** tested in real icing conditions on aircraft require robust characterization of **LWC, MVD, particle size, number and phase** -> measurements with well known, established “reference sensors”
- Generally **data on atmospheric conditions** that allow the formation of SLD **sampled in Europe** are still rare
- Atmospheric conditions that lead to **aircraft icing at higher altitudes** are rare
- **Numerical weather prediction models** and icing forecasts need defined, high resolution measurements to **validated** their products
- **Icing climatologies (based on NWP or measurement data)** help to assess the best location for aircraft campaigns to test sensors in relevant conditions







# SENS4ICE

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## Assessment of Climatological Means of Icing Conditions for targeted time and altitude of the SENS4ICE measurements

Deutscher Wetterdienst  
Wetter und Klima aus einer Hand



 CERFACS

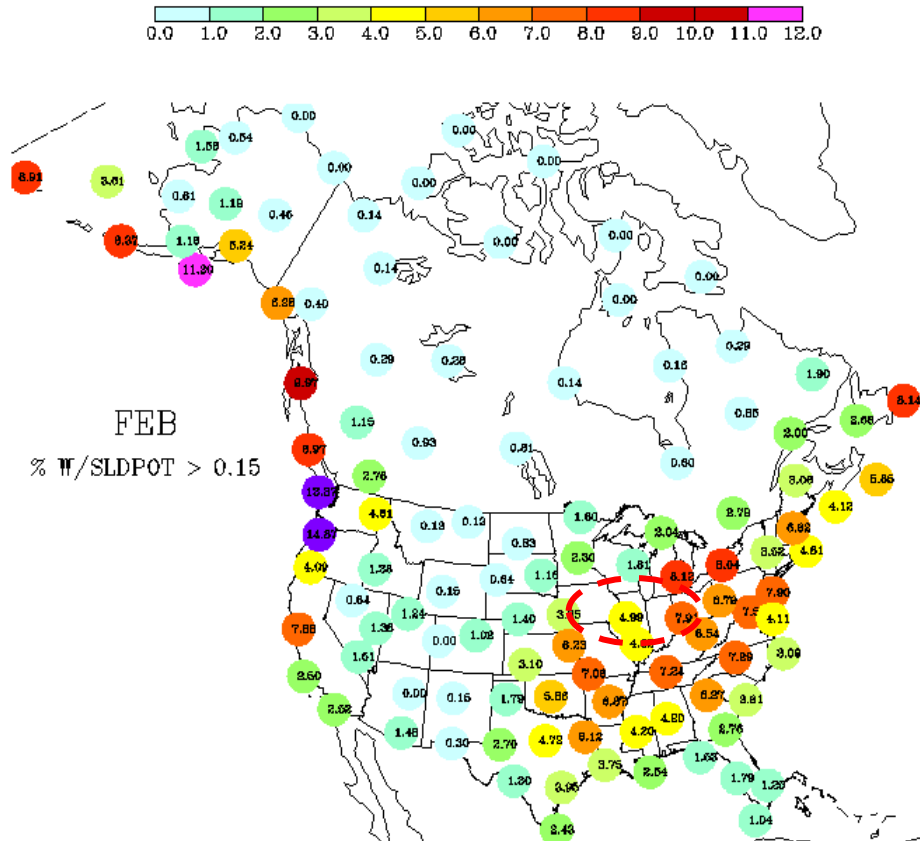
CENTRE EUROPÉEN DE RECHERCHE ET DE FORMATION AVANCÉES EN CALCUL SCIENTIFIQUE



Italian Aerospace Research Centre



# Climatology of icing (SLD) in the US



- Product for SLD icing potential derived from 15 years of data (1997-2001) using CIP-sonde icing algorithm, combining coincident profiles of + weather balloons + surface observations
- SLD potential was derived from counting sounding with values above 0.15, indicating that there is a small chance of SLD
- Here shown full column for the month of February → months of the campaign
- Regions with enhanced SLD are the Northwestern coastal region and from the South Central U.S. through the Southern Great Lakes and Mid-Atlantic
- Further requirements: areas of flat terrain and low air traffic choose the operations base for the Phenom 300

From study by Bernstein et al., 2007



# Climatology of icing (incl. SLD) in Europe

Complimentary data sets were used to assess the question on the best location for stationing SAFIRE'S ATR-42 in April in Europe.

Three more recent data sets:

1. ) ADWICE –ICON (Deutscher Wetterdienst)
2. ) ICEP – ERA5 (CERFACS)
3. ) MSG Satellite retrieval (CIRA)



Important safety requirements for SLD encounters (severe icing) of the aircraft had to be considered

- 8000ft of min. altitude
- warm air layer ( $T > 0^{\circ}\text{C}$ ) below
- no air traffic or complex terrain below

in order to allow the aircraft to deice before continuation of the flight.

These requirements were included in the climatological assessment.

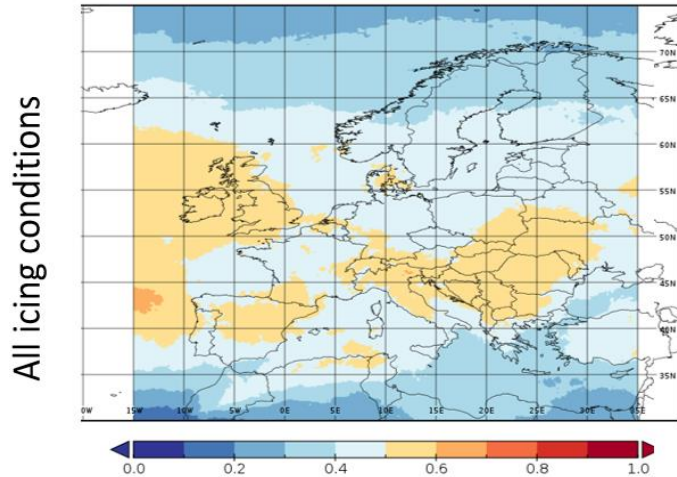




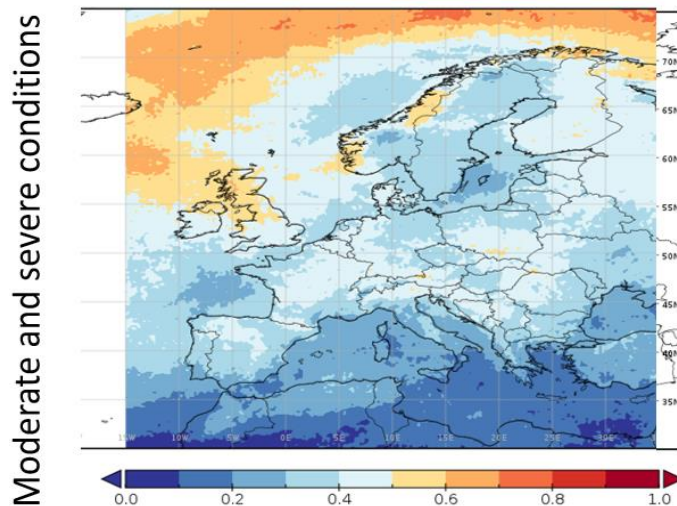
# Icing frequencies from ADWICE (DWD)

Provided by Frank Kalinka

Above 750 hPa



All altitudes



- ADWICE (Advanced Diagnosis and Warning System for Aircraft Icing Environments) reforecasts from 2015 till 2020
- ICON model with a resolution of  $0.25^\circ \times 0.25^\circ$
- total of 16950 h of data
- hourly resolution, 4 times daily revised on 32 pressure levels

Shown here: geographical distribution of the mean frequency of icing in April

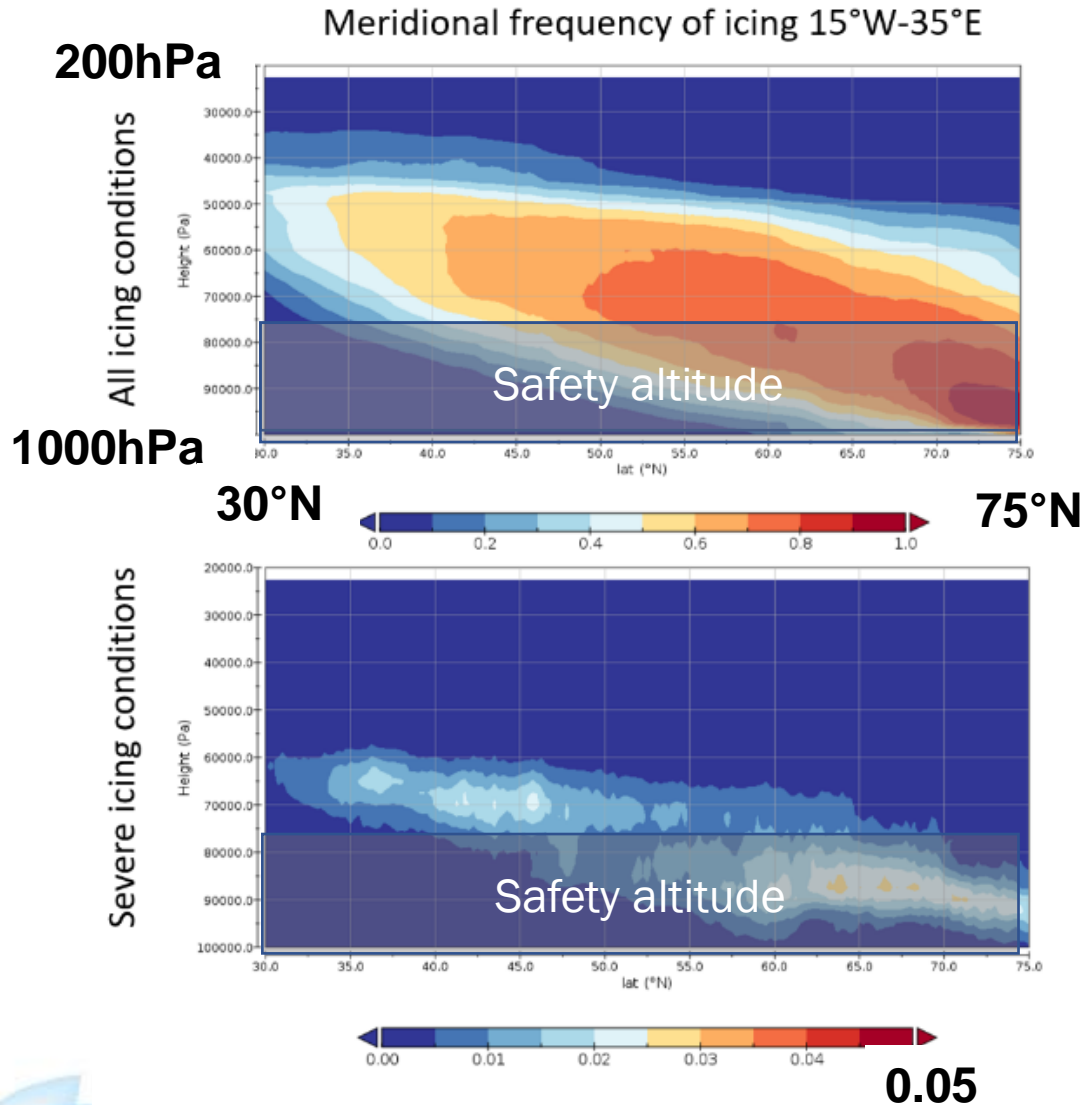
Moderate and severe icing is most frequently indicated above the North Atlantic (ground to 350hPa)

For the higher levels (750-350hPa), Southern European countries suggest higher frequencies of icing (Atlantic and Mediterranean Sea)



# Icing frequencies from ADWICE (DWD)

Provided by Frank Kalinka

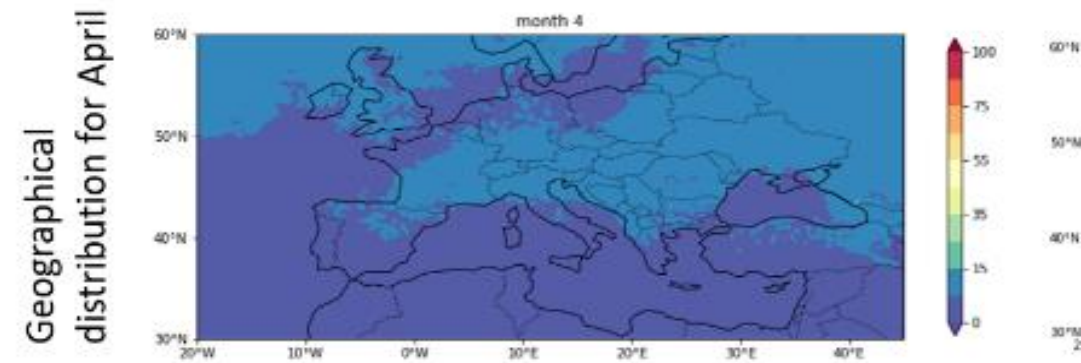
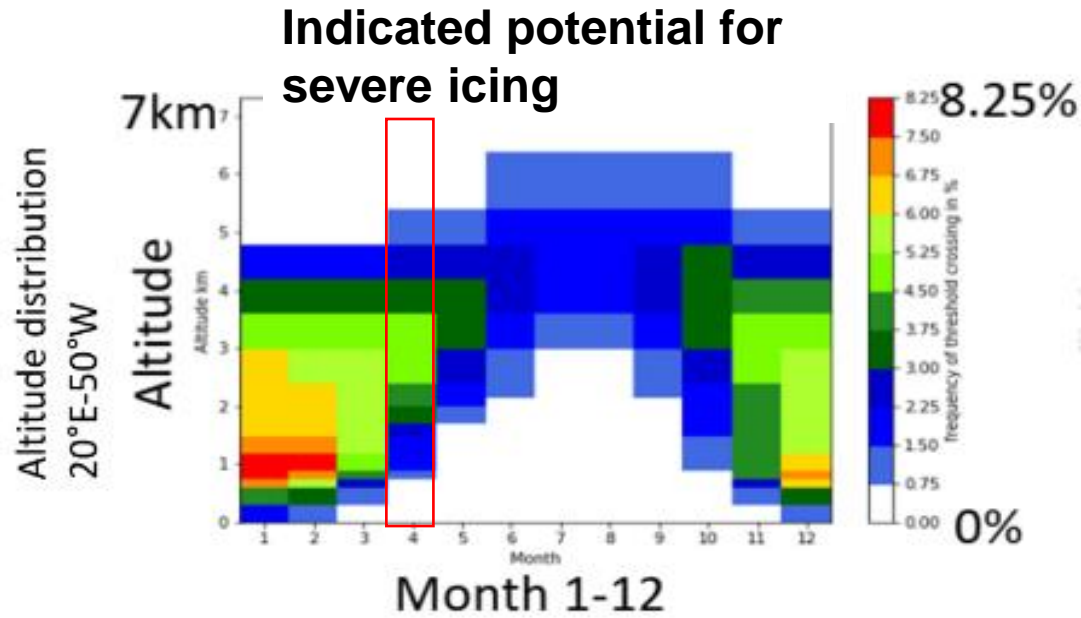


- Meridional cross sections of all icing conditions from long 15°W to 35°E for April
- Northern European countries experience icing at lower altitudes/higher pressures (up to 800hPa)
- Southern European countries show enhanced frequencies up to 400hPa (45-55%)
- Severe icing is just a subset of the all icing conditions with a rather low frequency (2%)
- ADWICE estimates these conditions up to 6000 hPa at southern European countries



# Icing frequencies from ICEP (CERFACS)

Provided by Chistian Pagé



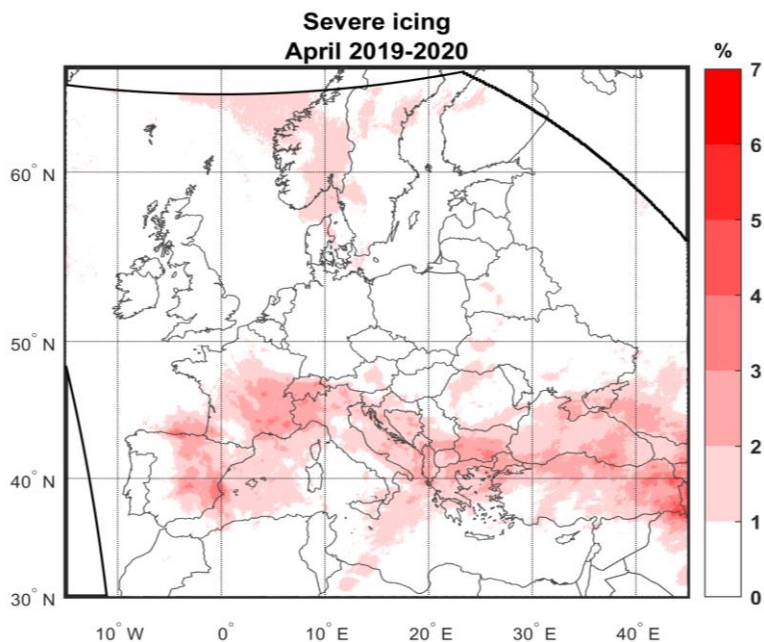
- Icing index from Météo France's ICE Potential forecast index (ICEP)
- computed from relative humidity (RHw) and temperature (T) on different atmospheric pressure levels.
- Degree of severity from 0 to 10
- A high icing index ( $\geq 8$ ) has a greater potential of severe icing as indicated by ICEP
- In contrast to SIGMA, ICEP does not use satellite, radar or other observational data.
- The data set comprises more than 40 years of ERA-5 data with a resolution of  $0.5^\circ$  on 20 vertical levels
- Annual variability shows probability of icing on the order of  $\sim 5\%$  between 2 and 4 km in April



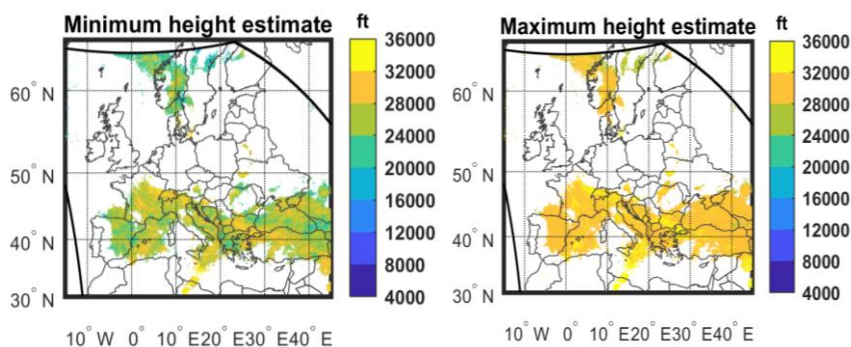


# Icing frequencies from MSG retrieval (CIRA)

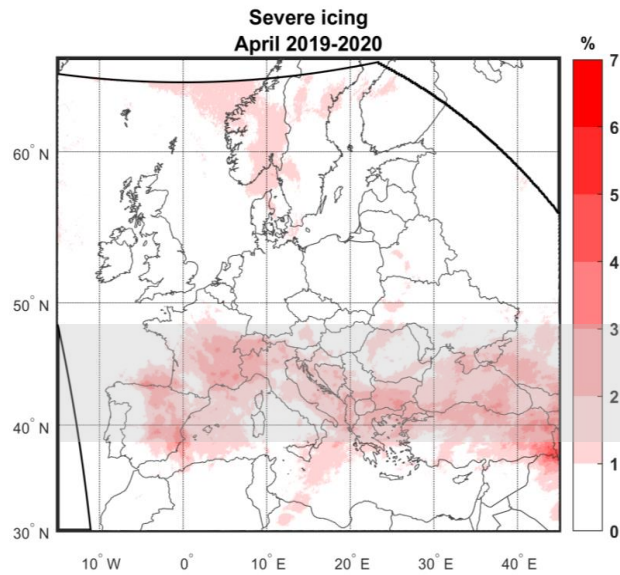
Provided by Alessandra Zollo, CIRA



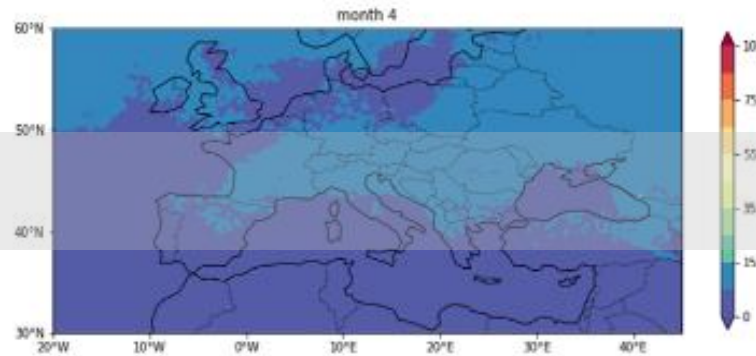
- ❖ Satellite images and microphysical properties derived from **Meteosat Second Generation (MSG)** were used to infer severe icing frequencies
- ❖ Algorithm developed by CIRA (Zollo et al., this session)
- ❖ Spatial and temporal resolution of 3 km and 15 min
- ❖ April data from two years 2019 and 2020 are here combined
- ❖ Minimum and maximum altitude estimate for indication of severe icing are shown
- ❖ Southern European Countries indicate enhanced frequencies (up to 7%)
- ❖ Icing may reach up to 30000ft



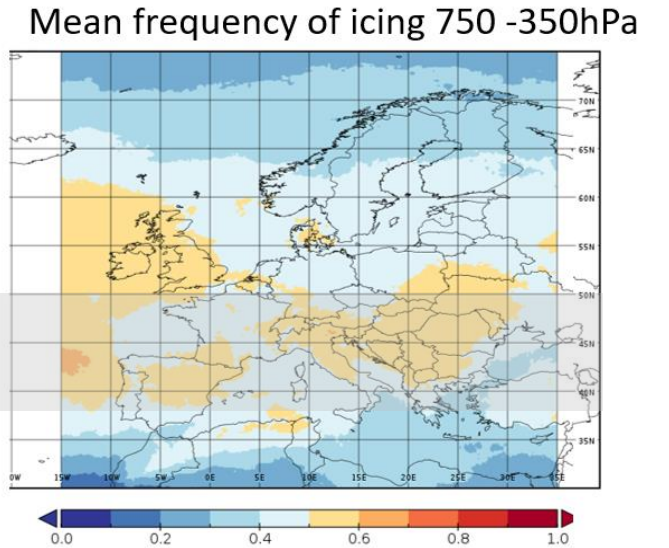
# Summary on climatologies



Geographical distribution for April



All icing conditions



- Although icing frequencies were based on different data and evaluation methods with a **large spread in their probability of occurrence**, the pattern in each analysis suggests enhanced indicated icing frequencies in April in **Southern France, Northern Spain and the Mediterranean Sea**.
- Toulouse was chosen as the base for operation combing occurrence frequencies and safety requirements in an optimal way







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## Overview on microphysical reference instrumentation



# Overview SENS4ICE Flight Campaigns

- 💧 Total flight time: 75h
- 💧 SENS4ICE-US: North America, base Alton, Illinois
  - 💧 February/March 2023
  - 💧 Embraer Phenom 300 operated by Embraer
  - 💧 **15 flights**
  - 💧 **25 flight hours**

Reference instruments operated by EMB and SEA

- 💧 SENS4ICE-EU: Europe, base Toulouse
  - 💧 April 2023
  - 💧 French ATR 42 environmental research aircraft of Safire
  - 💧 **15 flights**
  - 💧 **51.5 flight hours**

Reference instruments operated by DLR and Safire

## Embraer Phenom 300



Copyright © Embraer

## SAFIRE ATR 42



Copyright © DLR



# Reference instrumentation during SENS4ICE-US



**CCP and ice crystal detector on Phenom 300**

💧 CCP was used as reference instrument also for SENS4ICE wind tunnel tests (Lucke et al., 2022) to ensure consistent data evaluation

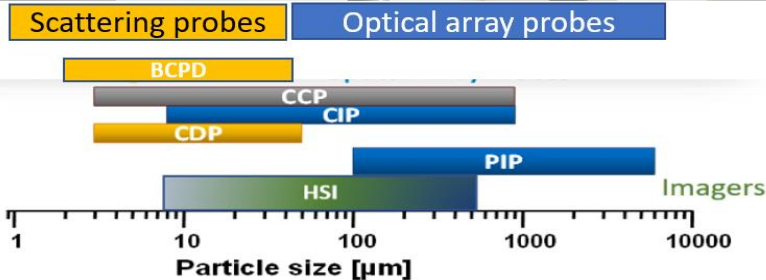
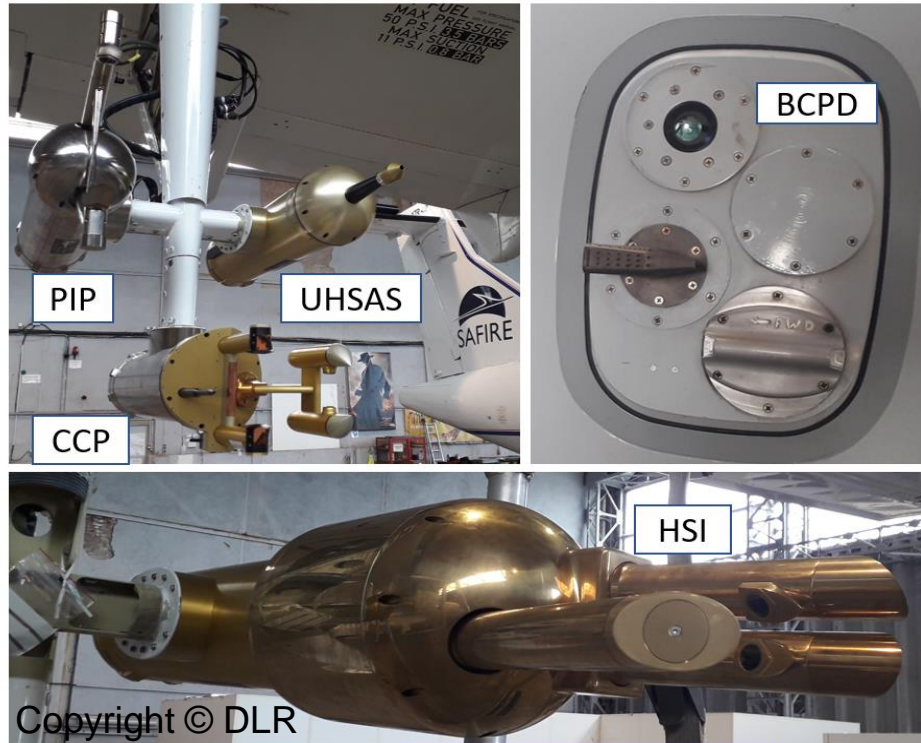


Picture courtesy Dan Bouley

Instrument	Measured parameter	Range	Reference
Ice Crystal Detector	LWC and TWC	0.2 – 5 g m <sup>-3</sup>	Lilie, et al., 2021
Cloud Combination Probe (CCP)	Cloud droplet number and size	2 – 960 μm	See also Lucke et al., 2022, AMT



# Reference instrumentation during SENS4ICE-EU



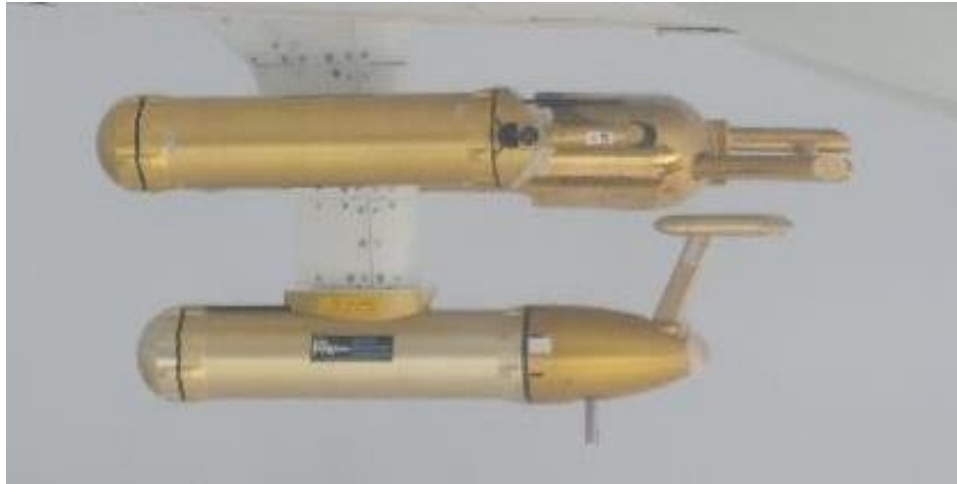
Instruments for measurements of microphysical properties comprise :

- 💧 Particle size distribution: CCP and PIP  
2 -6400 µm
- 💧 LWC, TWC : Nevzorov 0.03 -3 g m<sup>-3</sup>
- 💧 Particle shape and information on phase :  
HSI (High Speed Imager) and BCPD (Backscatter cloud probe)
- 💧 Icing detection: Robust Probe (Safire)
- 💧 Aerosol number and size :UHSAS (Safire)





# Reference instrumentation during SENS4ICE-EU



Ice accretion on reference sensors observed during test flight (© DLR)

Instrument	Measured parameter	Range	Reference
Cloud Combination Probe (CCP)	Cloud droplet number and size	2 - 960 $\mu\text{m}$	Lucke et al., 2022
Precipitation Imaging Probe (PIP)	Cloud droplet and ice crystal number and size	100-6400 $\mu\text{m}$	De La Torre Castro, et al., 2023
High Speed Imager (HSI)	Droplet and Ice particle size and complexity	2-2000 $\mu\text{m}$	Esposito, et al., 2019
Nevzorov Probe	LWC and TWC	0.03 -3 $\text{g m}^{-3}$	Korolev, et al., 1998 Lucke, et al., 2022
Backscatter Cloud Probe with Polarization Detection	Droplet and ice crystal size and asphericity (phase)	2- 42 $\mu\text{m}$	Lucke et al., 2023



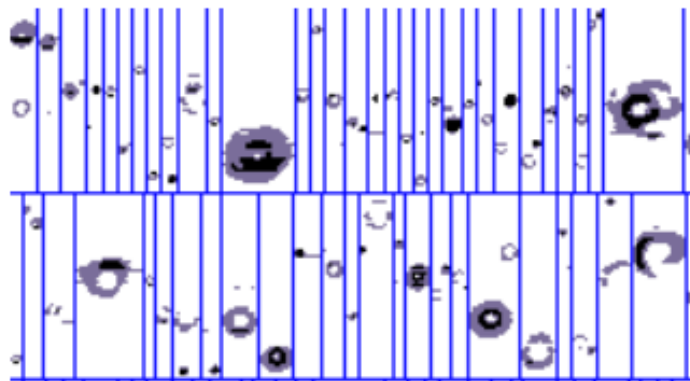


# Data evaluation

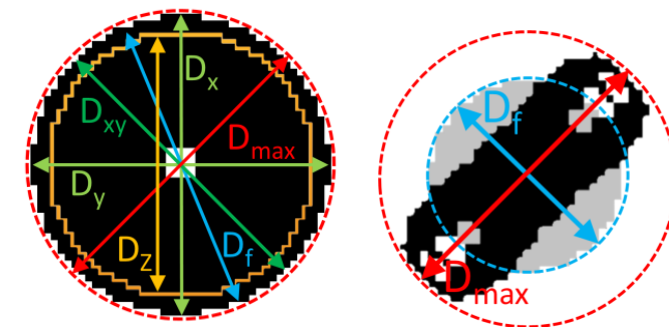
provided by Johannes Lucke and Deniz Menekay



- Optical array probe measurements from the CIP are used to provide
  - particle size distribution (in combination with CDP)
  - shape analysis (differentiate ice particles from droplets)
- Filter for 3 kinds of particles: SLD, small droplets, ice crystals
- The filters are not perfect: Number of detected particles of each category tends to be underestimated → future work!
- Some ambiguities (especially between out-of-focus ice crystals and SLD) are possible
- Further corrections: Shattering correction, out-of-focus correction, all-in method, stuck-bit and air speed correction



CIP Grey scale images  
15  $\mu\text{m}$  resolution  
75% greyscale level



Dissertation  
S. Kirschler and E. De La Torre Castro



# Classification of icing and SLD encounters

provided by Johannes Lucke and Deniz Menekay

## SLD:

$LWC > 0.025 \text{ g m}^{-3}$

Large ice crystal  $> 1 \text{ L}^{-1}$  (Cober & Isaac 2012)  $\rightarrow$  sample out ice crystals

The LWC SLD  $> 1\%$  of total LWC (Cober & Isaac 2012)  $\rightarrow$  ensure significant fraction of LWC

SLD concentration  $> 10$  times ice particle concentration  $\rightarrow$  avoid mixed phase

SLD concentration  $> 100 \text{ m}^{-3} \sim 0.0001 \text{ L}^{-1}$   $\rightarrow$  ensure good statistics

The Nevzorov LWC  $> 60\%$  Nevzorov TWC measurement  $\rightarrow$  consider size range of Hotwire probe

Ambient temperature (SAT)  $< 0^\circ\text{C}$

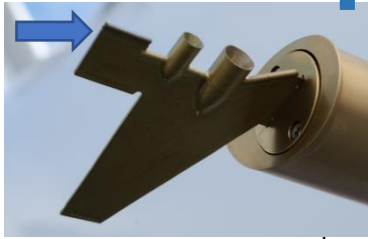
## Icing:

$LWC > 0.025 \text{ g m}^{-3}$

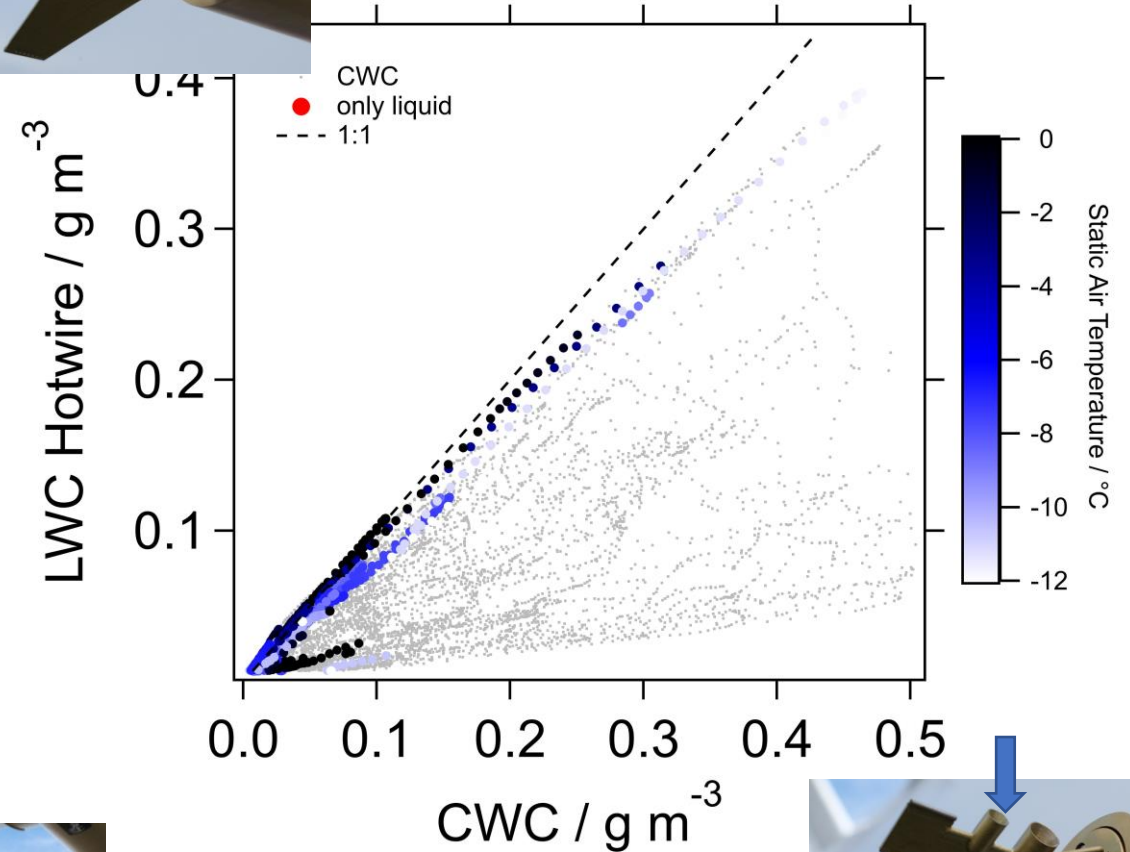
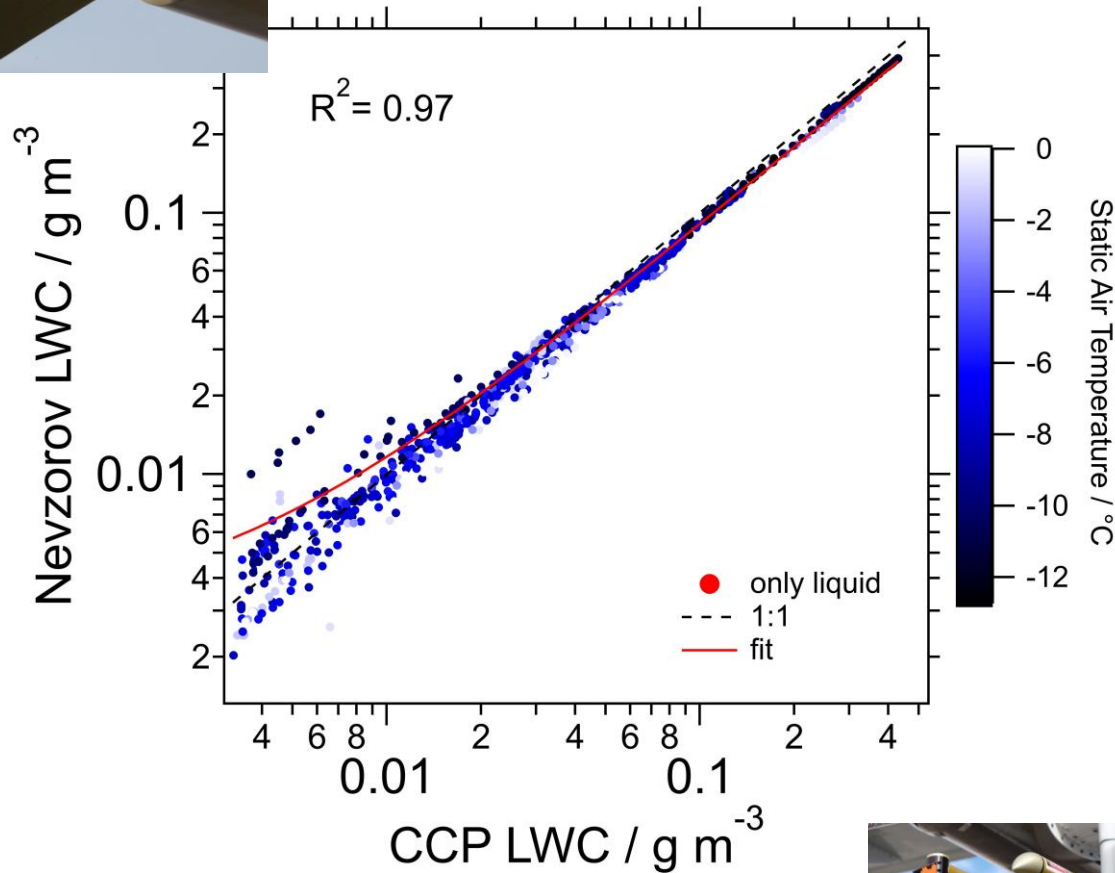
Ambient temperature (SAT)  $< 0^\circ\text{C}$



# Comparison of LWC from Nevzorov and CCP



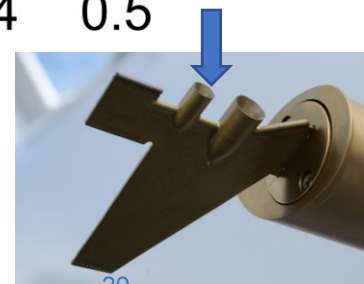
Preliminary data of OF13



Filters (liquid-ice) seemed to be working good

Sizing (volume) seems to be appropriate

SENS4ICE, EU-funded project, Grant Agreement No 824253





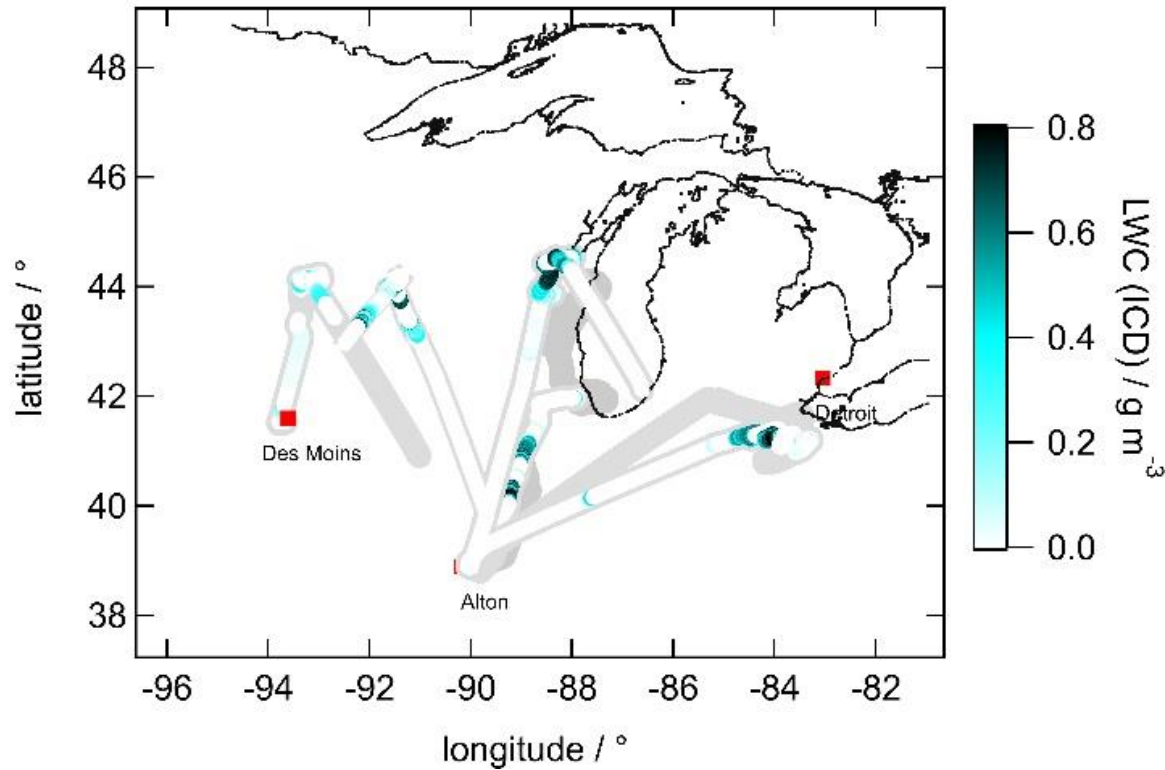
# SENS4ICE

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## **First preliminary data of microphysical cloud properties during the SENS4ICE-US and the SENS4ICE-EU Campaigns**



# Overview of measurements during SENS4ICE-US



Geographic distribution of supercooled water encounters (grey areas== no clouds)

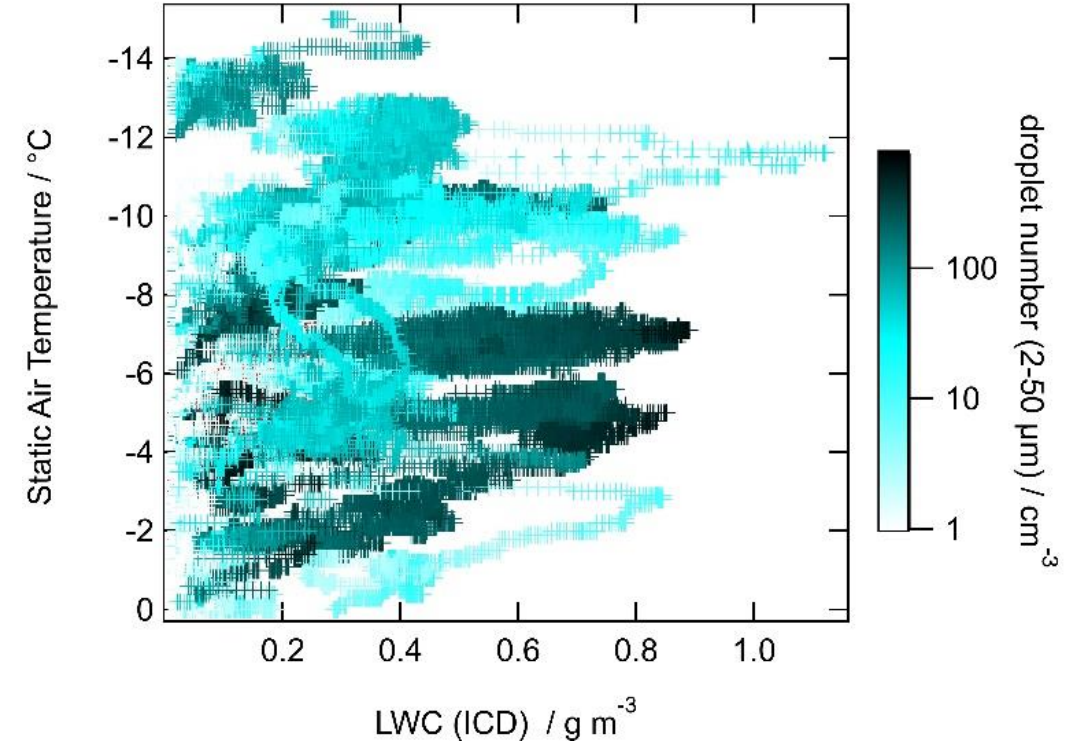
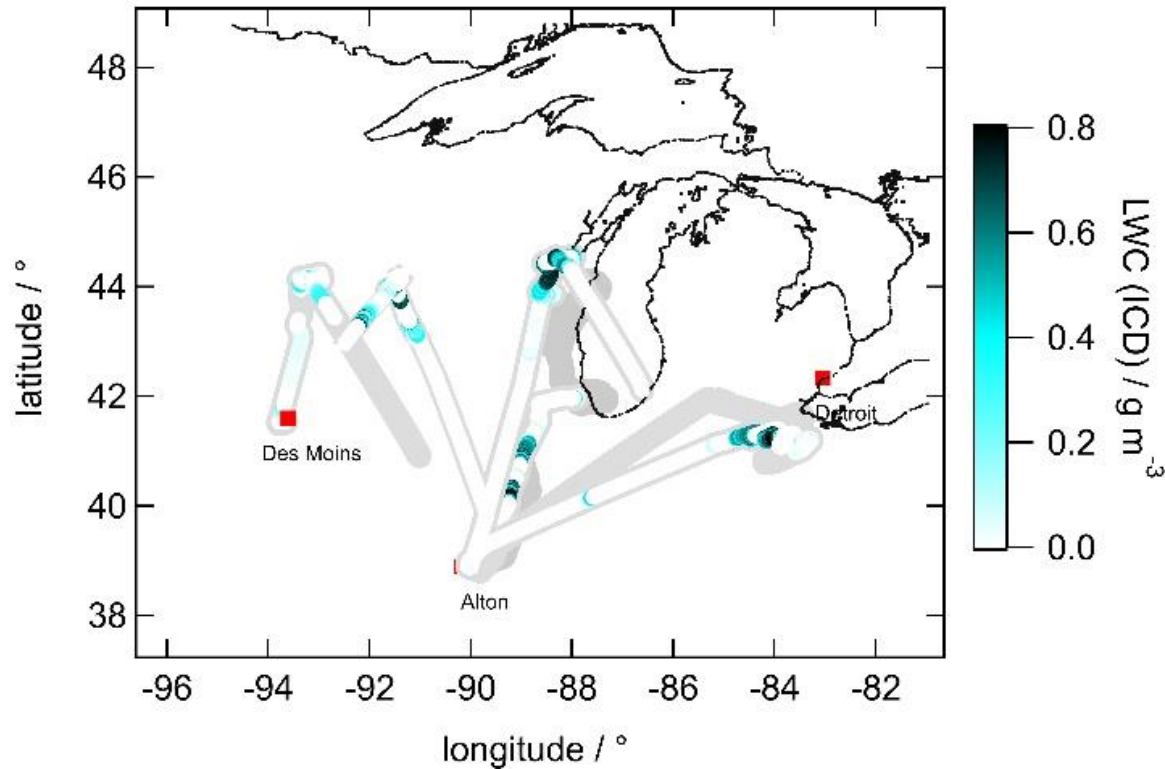
No	Date	Flight duration [hrs]	Comment
1	22 FEB	0:39	Check flight
2	23 FEB	2:45	Appendix O
3	23 FEB	1:12	Appendix C
4	25 FEB	2:03	Appendix O
5	25 FEB	-	Appendix C
6	01 MAR	-	Appendix O
7	01 MAR	-	Appendix O
8	06 MAR	1:07	Appendix C
9	06 MAR	-	City Air
10	08 MAR	2:21	Appendix O
11	08 MAR	0:40	Return to base
12	08 MAR	-	Check flight
13	09 MAR	1:23	Appendix C
14	10 MAR	2:15	Appendix O
15	10 MAR	1:08	Appendix C

Instruments worked during all flights!!





# Overview of measurements during SENS4ICE-US



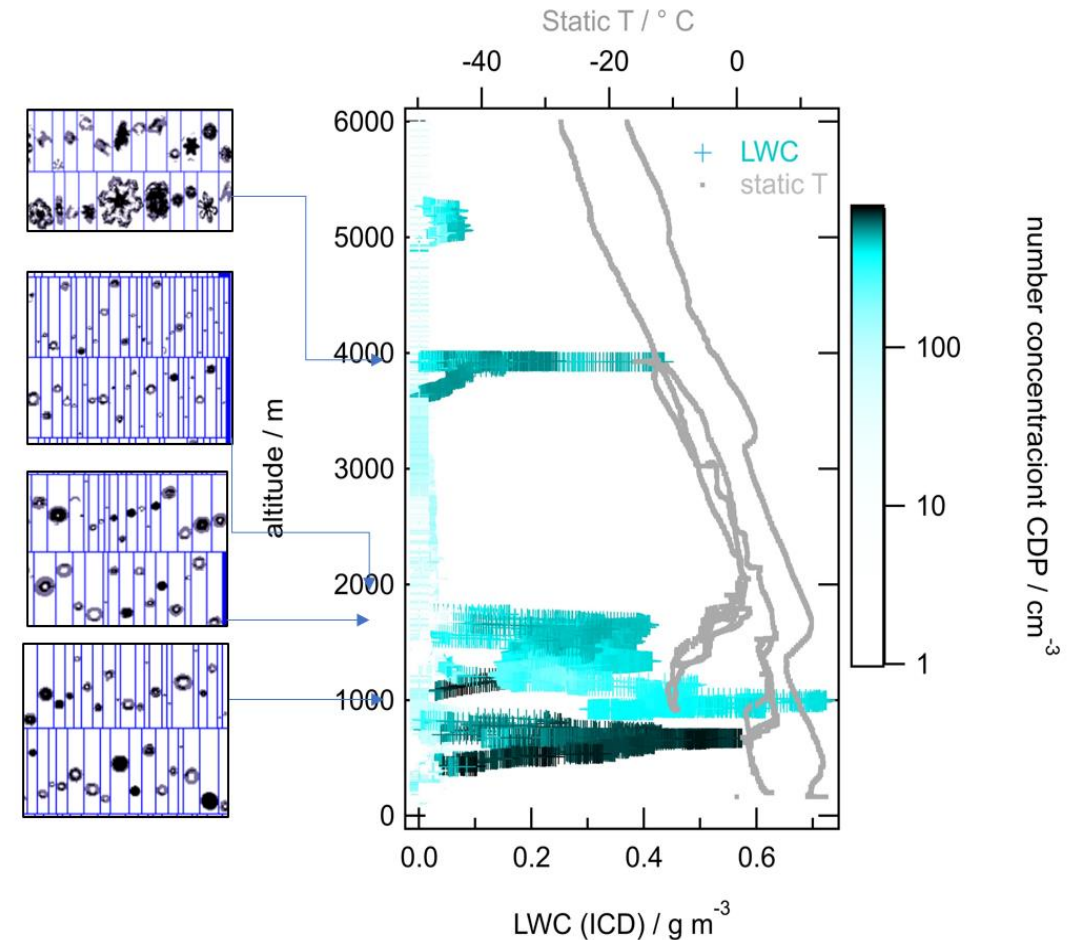
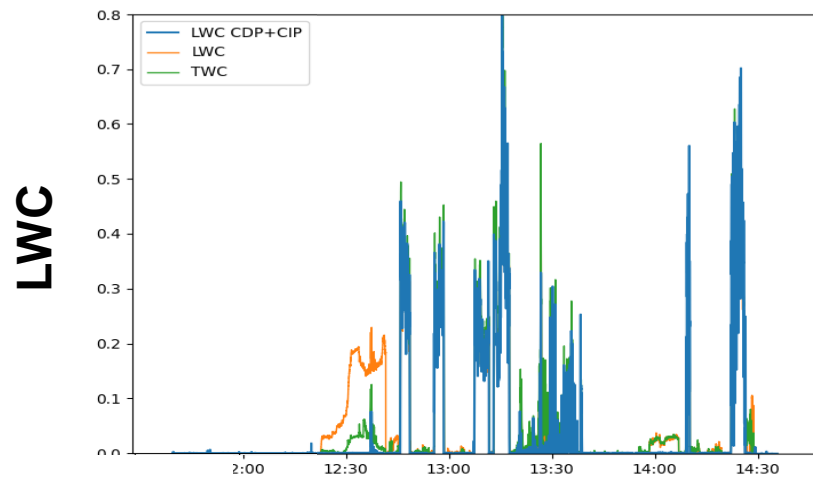
Geographic distribution of supercooled water encounters (grey areas== no clouds)

Temperature profile of LWC (ICD) of 8 flights during the SENS4ICE-US campaign



# Selected case from SENS4ICE-US

- Flight on 23 Feb 2023
- Good agreement of ICD and CCP+CIP LWC  
→ gives confidence in the data
- SLD present ( $< 0.1 \text{ g m}^{-3}$ ) but small droplets prevalent
- found SLD MVD ( $D > 100 \mu\text{m}$ ) reach up to  $250 \mu\text{m}$
- Further data evaluation needed

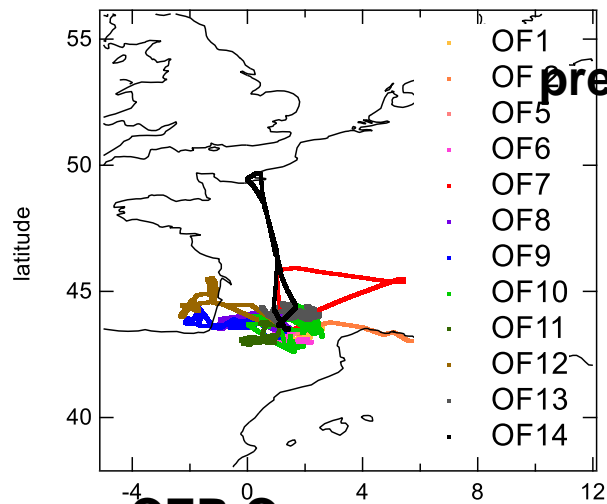


Layer 1: large droplets

Layer 2: small droplets

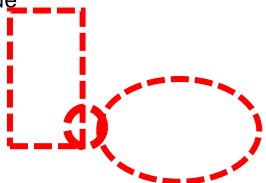


# Overview of measurements during SENS4ICE-EU



preliminary

CER Cazaux



CER Marsan

CER Toulouse

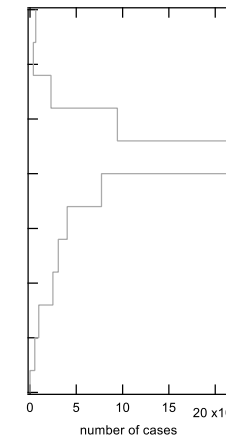
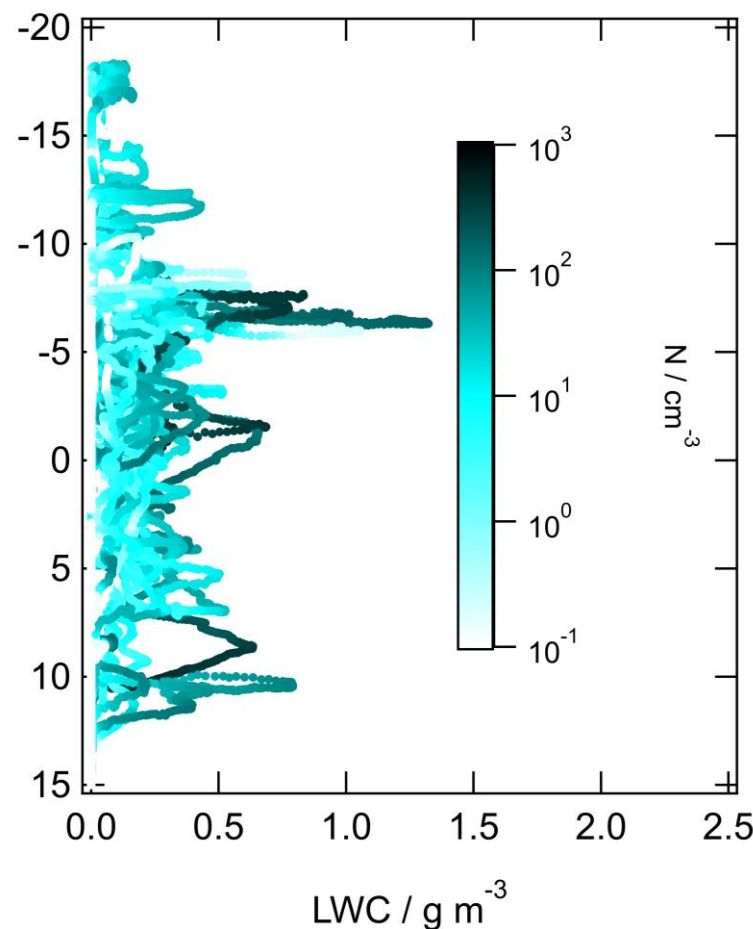
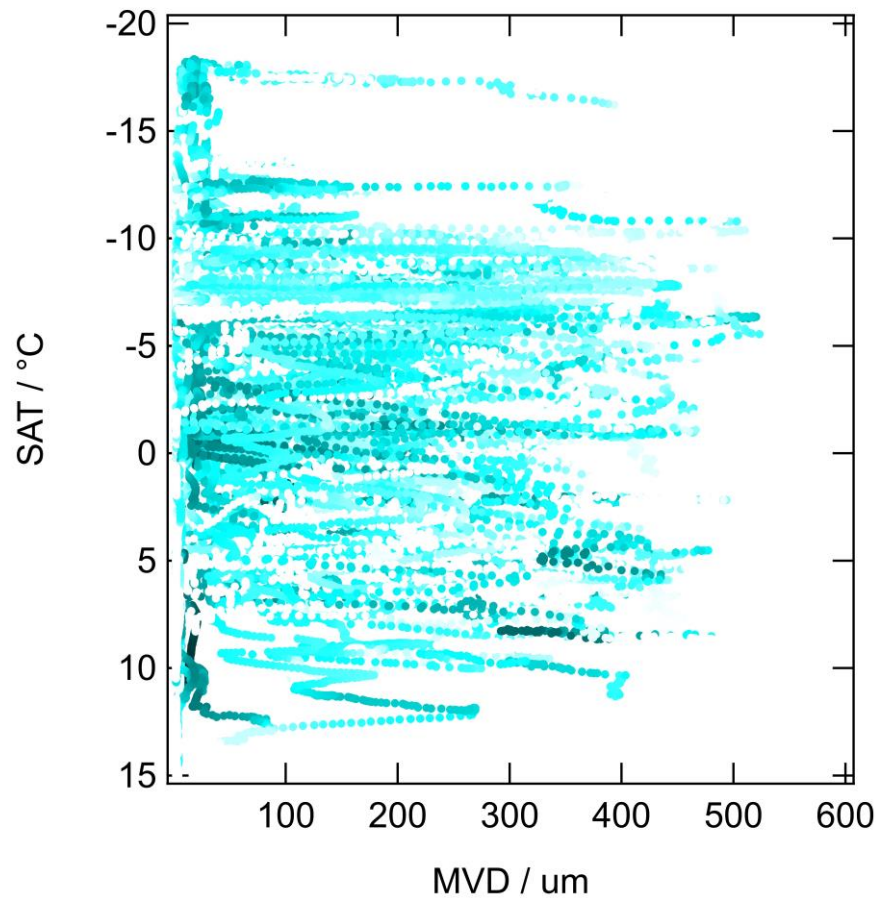
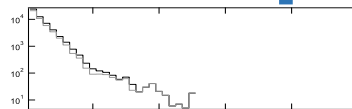
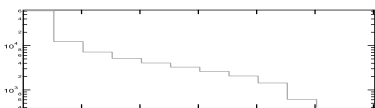
No.	Date	Area
★ 4 (OF1)	03.04	CER Toulouse
★ 5 (OF2_1 & 2_2)	04.04	Airways (Toulon)
6 (OF3)		Aborted (de-icing problem)
7 (OF4)		CER Cazaux & Toulouse
★★★ 8 (OF5)		CER Toulouse
9 (OF6)	18.04	CER Toulouse
10 (OF7)	20.04	CER Toulouse (Grenoble)
11 (OF8)	22.04	CER Toulouse & Marsan
★★★★ 12 (OF9)	24.04	CER Cazaux & Marsan
★★★ 13 (OF10)	25.04	CER Toulouse & Marsan
14 (OF11)	26.04	CER Toulouse
★ 15 (OF12)	26.04	CER Cazaux
★ 16 (OF13)	27.04	CER Toulouse
★★ 17 (OF14)	27.04	Airways (Le Havre)

Instruments worked during all but one flight!!



# Overview of SENS4ICE-EU microphysical measurements

Number of cases



Number of cases

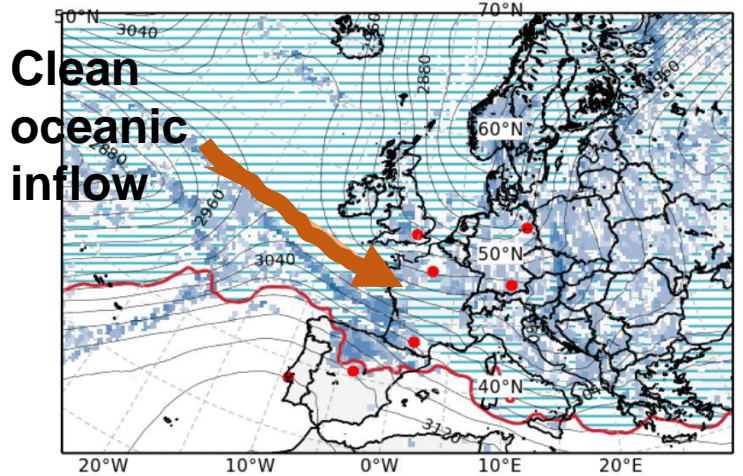




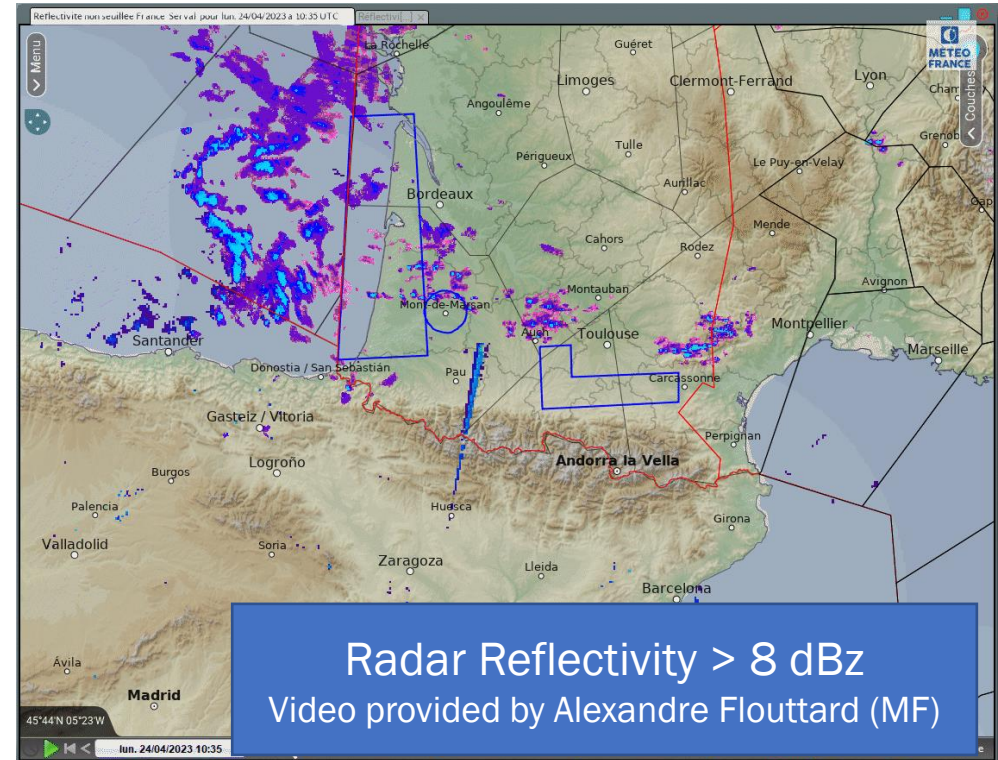
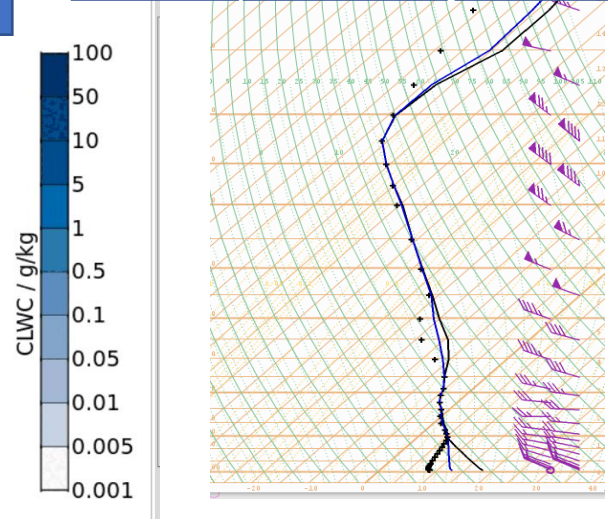
# Selected case from SENS4ICE-EU: OF09

Master thesis  
Deniz Menekay

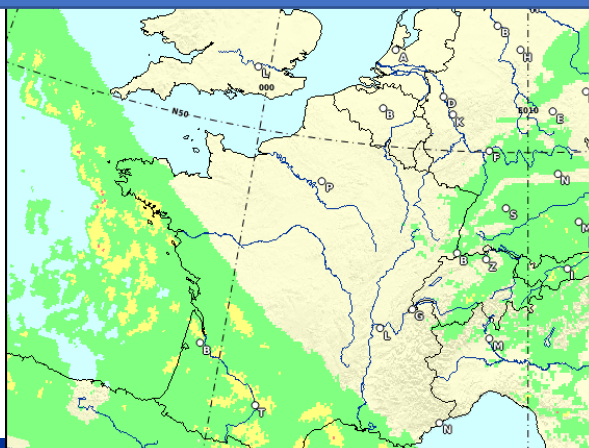
ECMWF CLWC at 700hPa © DLR



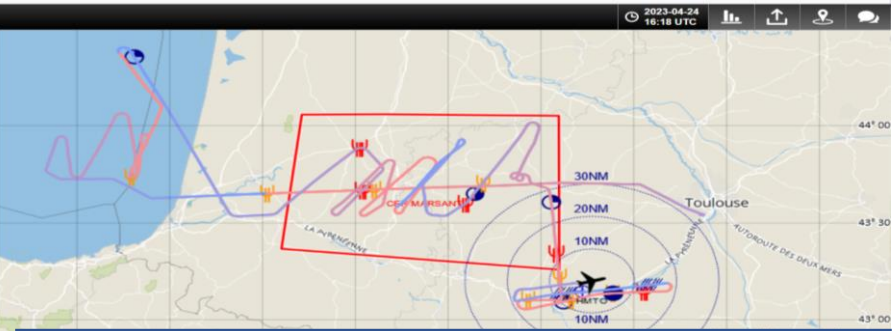
Model: Scewed T-Diagram provided by MF



ADWICE forecast © DWD



LIGHT MODERATE  
VT: 12 UTC Tue 25 Apr [ICON-EU 2023-04-24 00 UTC +36h]  
FL 140 (595 hPa): Icing Intensity



Planet with icing encounters © SAFIRE

Lagrangian tracking of a warm front with supercooled liquid water over 4 hours

High frequency of icing encounters thanks to excellent forecast and flight guidance!



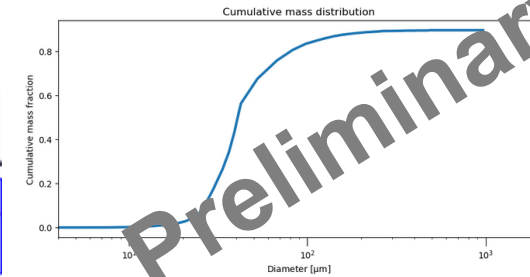
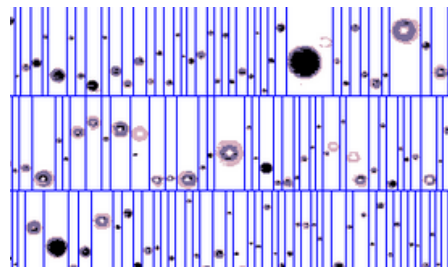


# Selected case from SENS4ICE-EU: OF09

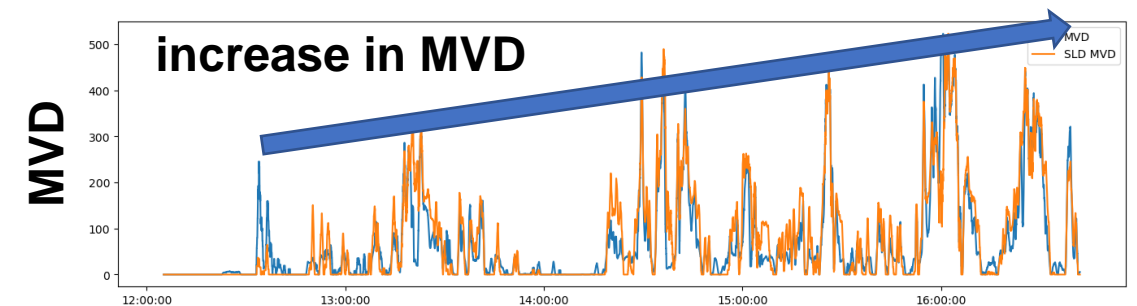
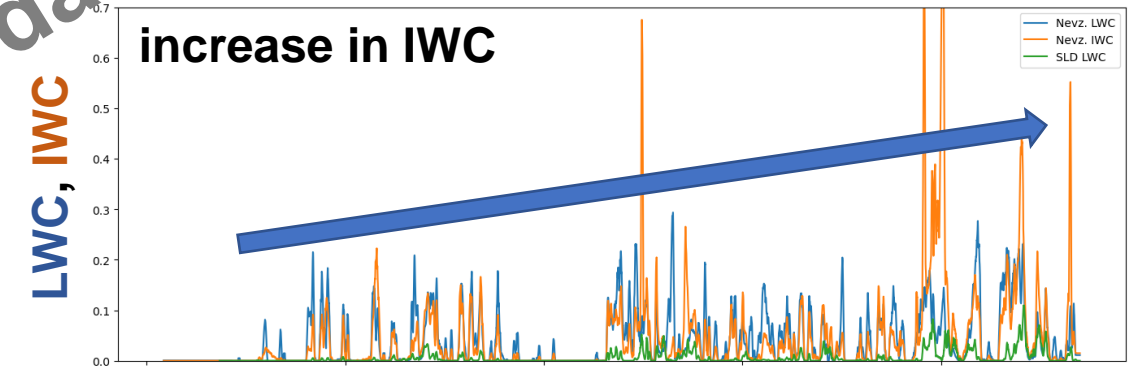
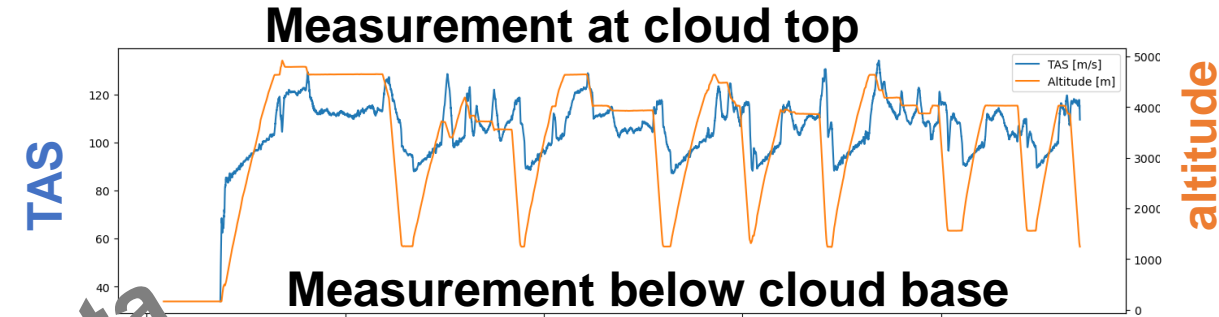
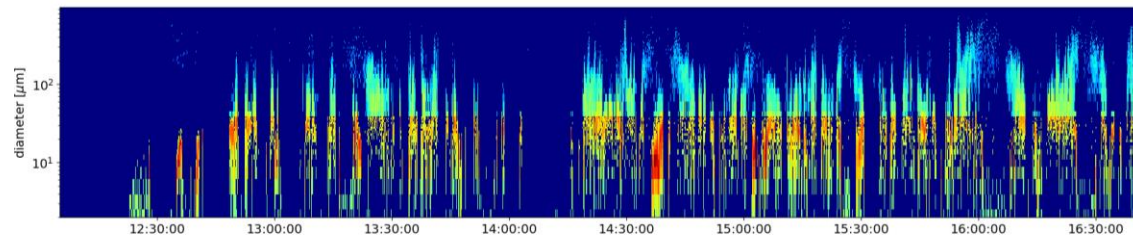
Master thesis  
Deniz Menekay

OF09 – 24 April 2023

- 🔹 Lagrangian tracking of the cloud with SLW
- 🔹 Total icing duration: 1:30:57
- 🔹 SLD duration: 0:20:19
- 🔹 34 SLD encounters (10 s min. duration)



Images at 12:52 UT

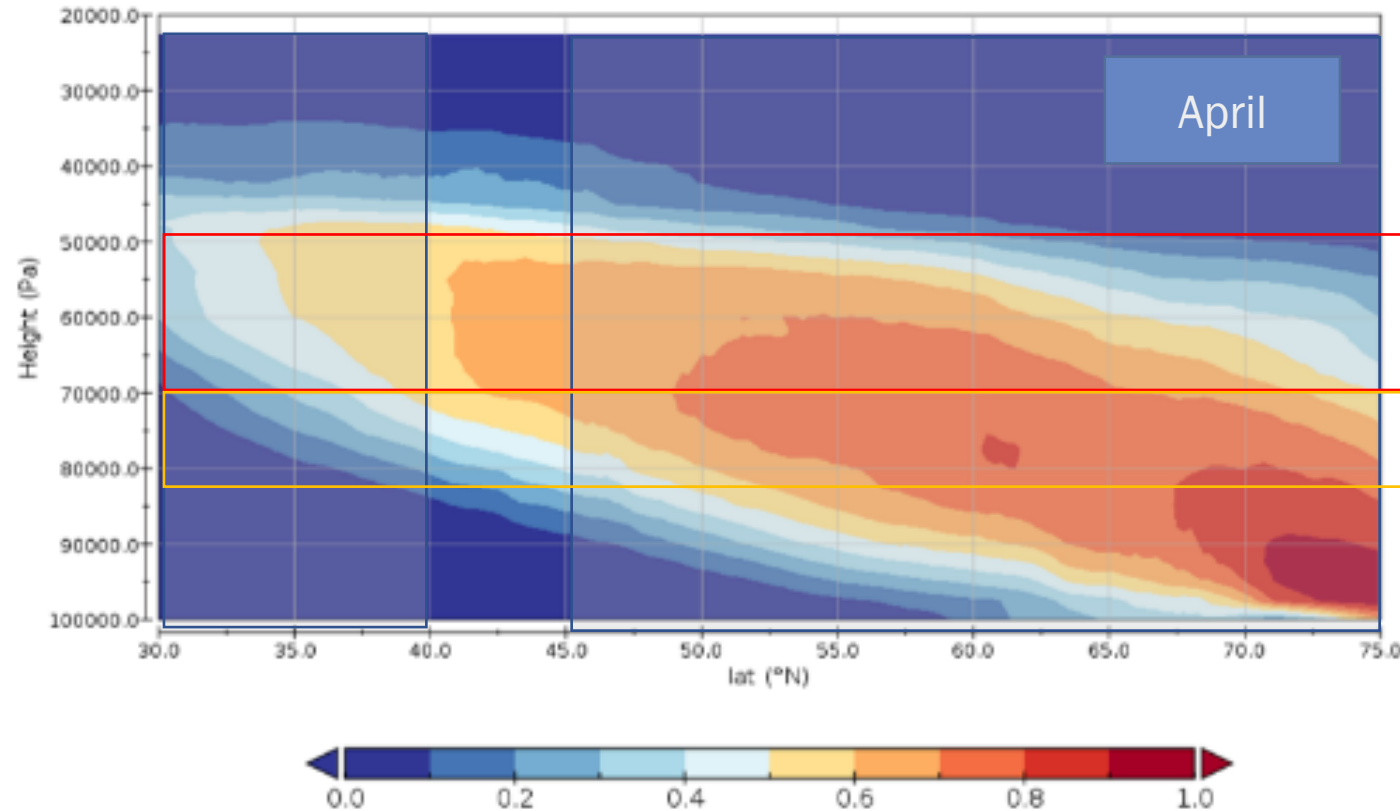


Further analysis needed!

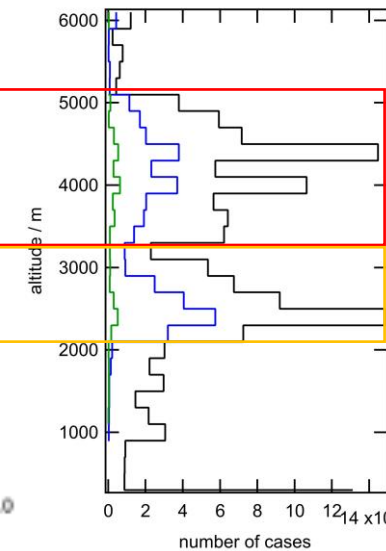


# Comparison of ADWICE climatological data to first results (altitude range) from airborne observations

All icing conditions



Two layers:  
~4500 m and ~2500 m



~ 8-16% } 3-5%

- Icing
- SLD
- All measurements

SLD of all icing conditions

SLD of all measurements

First preliminary (!) comparison of SENS4ICE-EU icing occurrence to meridional cross section from ADWICE climatology looks promising !! 😊



# Summary

- 💧 Two successful campaigns were conducted with a large variability of icing conditions  
→ group effort of aircraft and instrument operators as well as forecast teams!
- 💧 Comprehensive microphysical data set was acquired
- 💧 NEW: icing conditions in altitude range between 2 and 5 km were sampled at high frequencies
- 💧 Will be made available for the community for model validation and improvement of satellite retrieval after further refined evaluation and sensitivity studies
- 💧 Data analysis is in an early stage and ongoing :
  - ice vs liquid classification needs sensitivity study
  - comparison of two aircraft campaigns: contrasting winter and spring 2023 (US and EU)
  - process study on cloud evolution
  - comparison to other data sets like ICICLE etc.







**Thank you!!!**





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**Contact :**  
**Tina.Jurkat@dlr.de**

**SENS4ICE**

Visit our website [www.sens4ice-project.eu](http://www.sens4ice-project.eu)  
and LinkedIn [#sens4iceproject](https://www.linkedin.com/company/sens4iceproject)