



Deutsches Zentrum  
für Luft- und Raumfahrt  
German Aerospace Center



# SENS4ICE

SENSORS AND CERTIFIABLE HYBRID ARCHITECTURES  
FOR SAFER AVIATION IN ICING ENVIRONMENT

## Design and Testing of an Indirect Ice Detection Methodology

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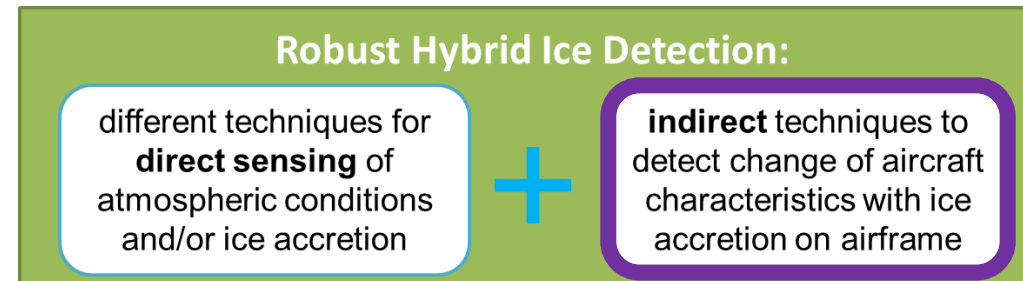
SAE Icing Conference, Vienna, Austria, June 2023

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# Introduction

- ❖ Hazardous effects of ice accumulations caused various accidents in the past despite the availability of countermeasures (anti-ice, deice)
- ❖ Resulting effects related to type and location of corresponding ice accretion, which have dependency on, e.g., atmospheric conditions, flight condition, aircraft geometry, ...
- ❖ Goal: early detection of ice accretion and icing conditions  
→ SENS4ICE Hybrid Ice Detection Approach



## ❖ Indirect Ice Detection System (IIDS)

- ❖ software solution for reliable, cost effective and retrofittable ice detection
- ❖ providing necessary information to maintain safe flight conditions
- ❖ potential enabler for more selective activation of anti-ice systems with reduced energy consumption

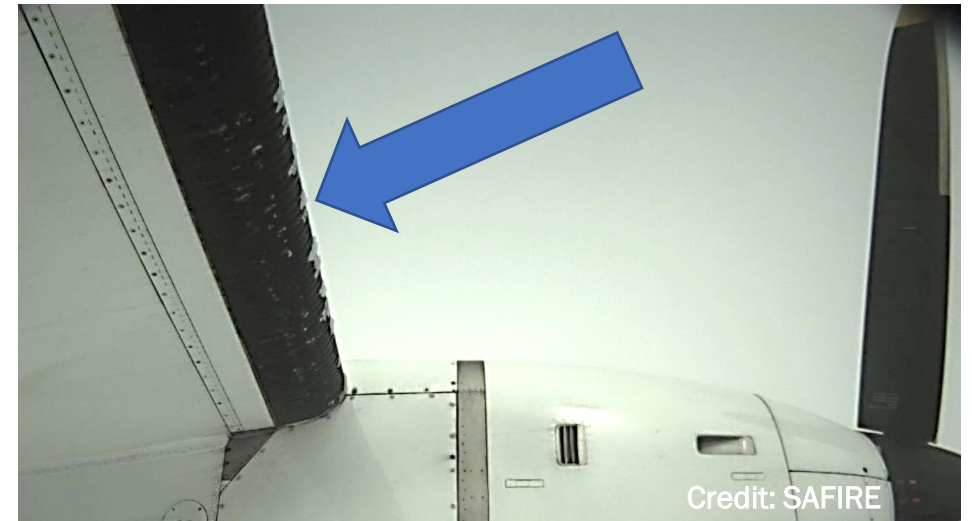


# Performance Based Ice Detection

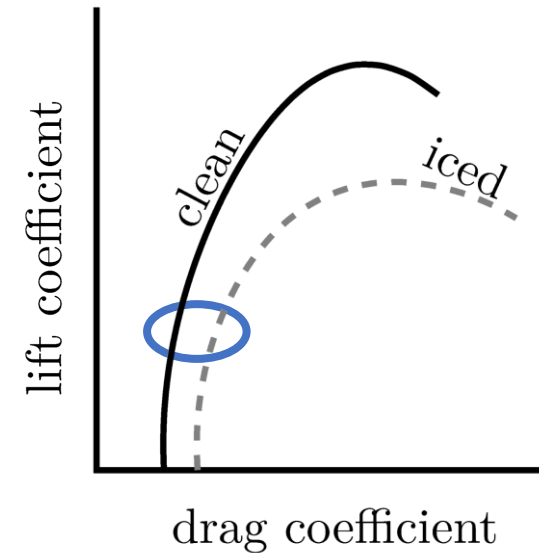
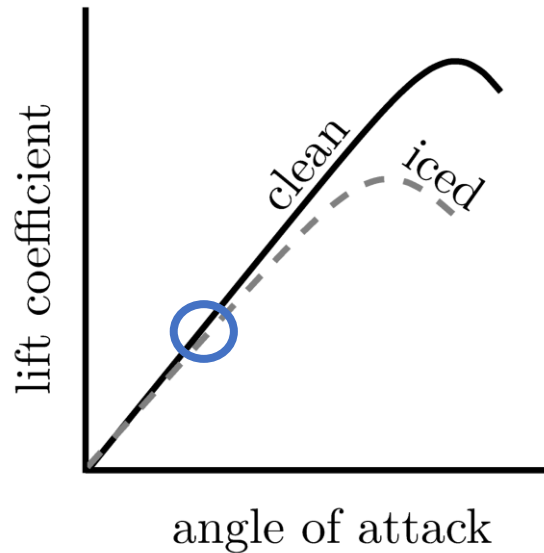
**Flight Performance** = Nominal Aircraft Performance



- 💧 “*Expectable Variation*”:
  - 💧 production tolerances
  - 💧 aircraft skin repairs
  - 💧 aircraft skin contamination, e.g., dirt
  - 💧 engine aging causing reduced efficiency
  - 💧 or engine contamination
- 💧 “*Variation to be detected*”:
  - subject to the indirect ice detection approach



# Ice Detection System based on the Aircraft Performance: Basic Principle



## Change of lift resp. pitch coefficient derivatives ( $C_{L\alpha}$ , $C_{m\alpha}$ )

- + Almost fully conserved within linear dynamic models
  - direct use of the tools from linear control theory possible
- Also significantly impacted by other phenomena
  - not specific enough
- Excitation needed for proper detection (steady flight is an issue)

## Change of drag polar (glide ratio)

Remark: Information lost during linearization

- + Seems to characterize very well the effects of ice accretion
- + Detection during steady flight conditions

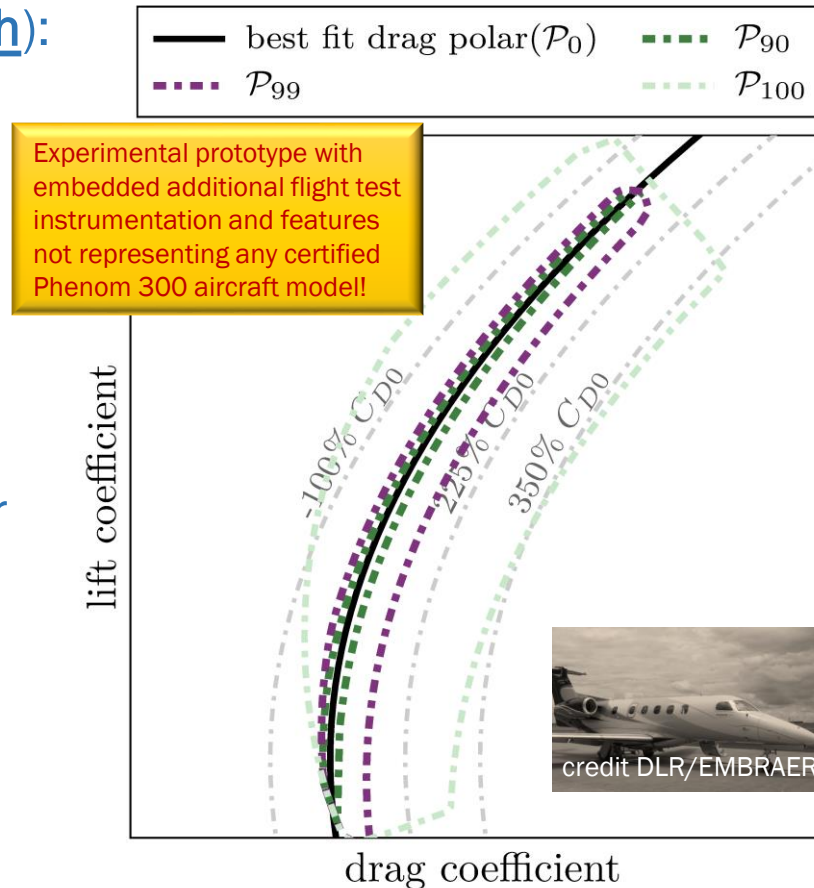


# Performance Variation of SENS4ICE Flight Test Benches

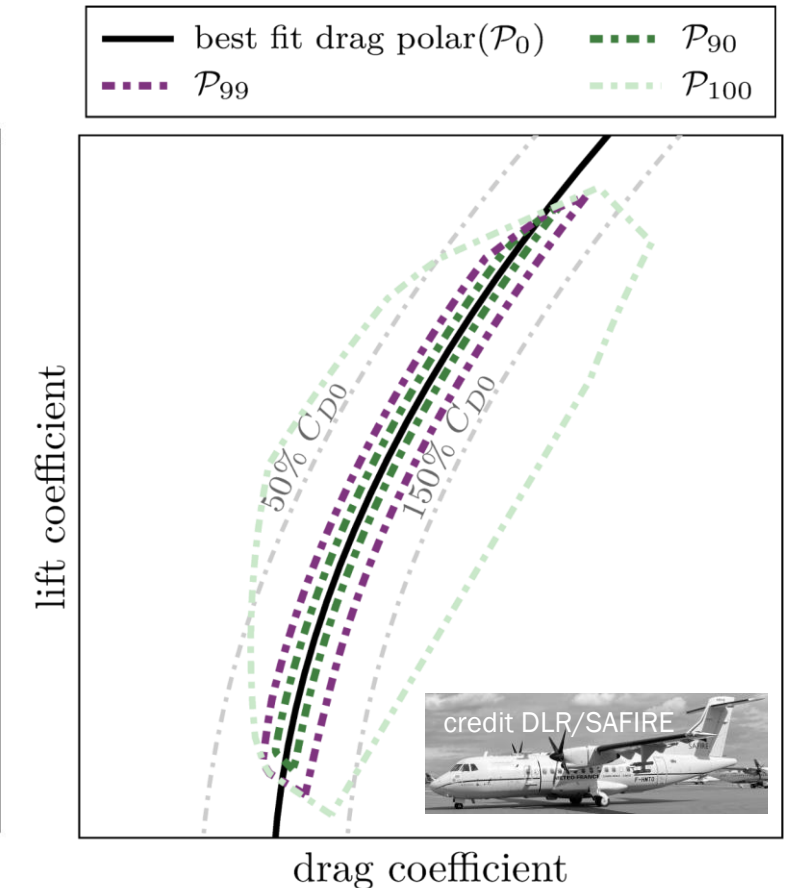
Big data analysis using  
fundamental engineering  
knowledge (smart data approach):

- 💧 operational flights similar to SENS4ICE target application
- 💧 only standard instrumentation as source of information
- 💧 Conclusions:
  - monitoring of aircraft flight performance using the regular sensors possible
  - level of precision allows detection of performance degradation induced by ice accretion at a very early stage

Embraer Phenom 300 prototype  
(North America flight test campaign)



ATR 42-320 flight test bench  
(European flight test campaign)



Credit: DLR / Embraer / Safire



# Performance Based (Indirect) Ice Detection

Abnormal Aircraft Performance Monitoring:

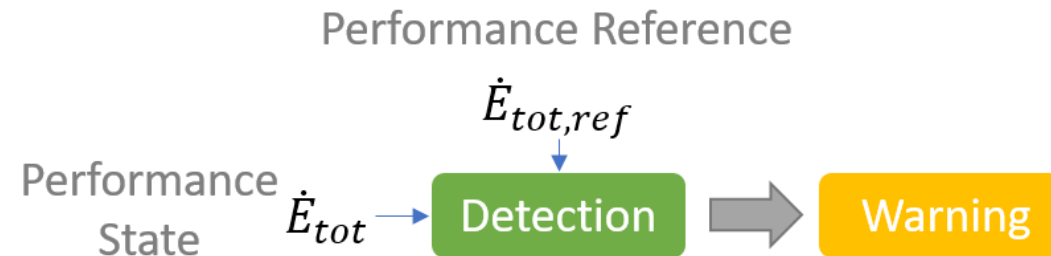
◆ Total Energy:

$$E_{tot} = \frac{1}{2} \cdot m_{AC} \cdot V_{TAS}^2 + m_{AC} \cdot g \cdot H$$

◆ Power Imbalance:

$$\dot{E}_{tot} = V_{TAS} \cdot \dot{V}_{TAS} \cdot m_{AC} + \frac{1}{2} \cdot V_{TAS}^2 \cdot \dot{m}_{AC} + g \cdot \dot{H} \cdot m_{AC} + g \cdot H \cdot \dot{m}_{AC}$$

◆ Detection Principle



◆ Performance variation as equivalent drag coefficient

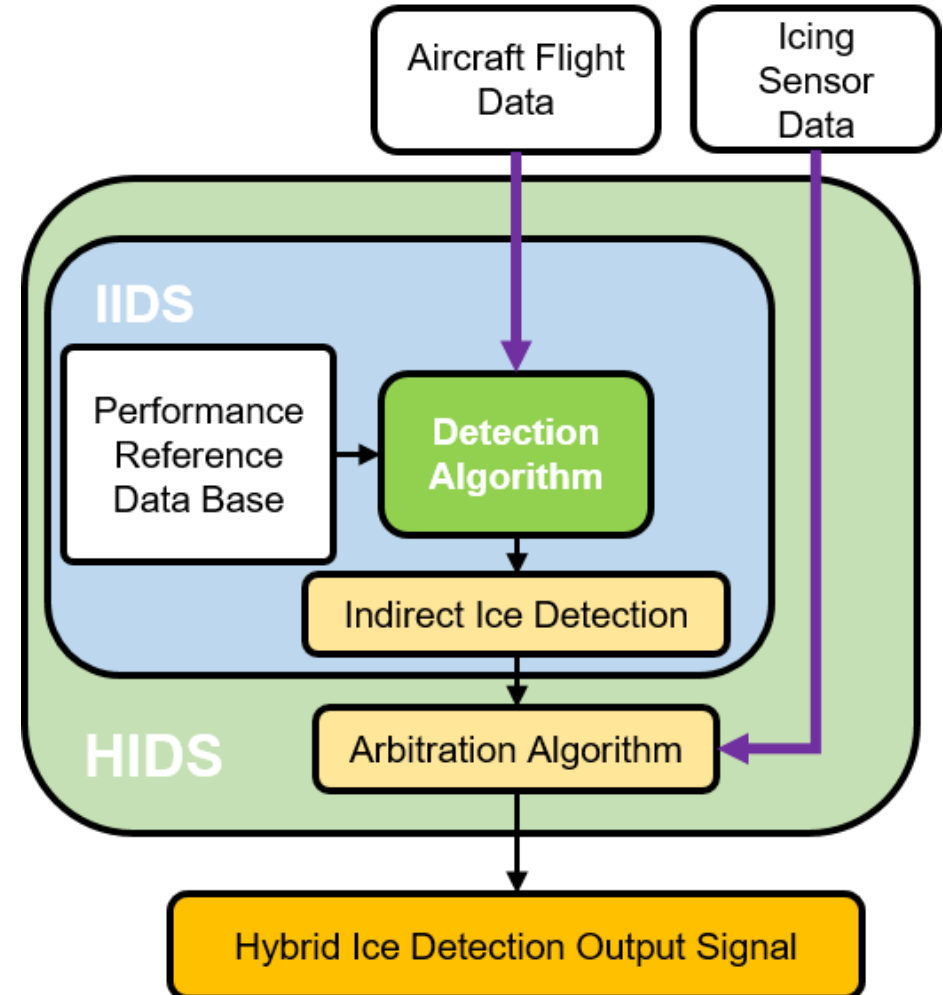
$$\Delta C_{\bar{D}} \approx \frac{\dot{E}_{tot,ref} - \dot{E}_{tot}}{V_{TAS} \cdot \bar{q} \cdot S}$$

with  $\dot{E}_{tot,ref}$  subject to further corrections



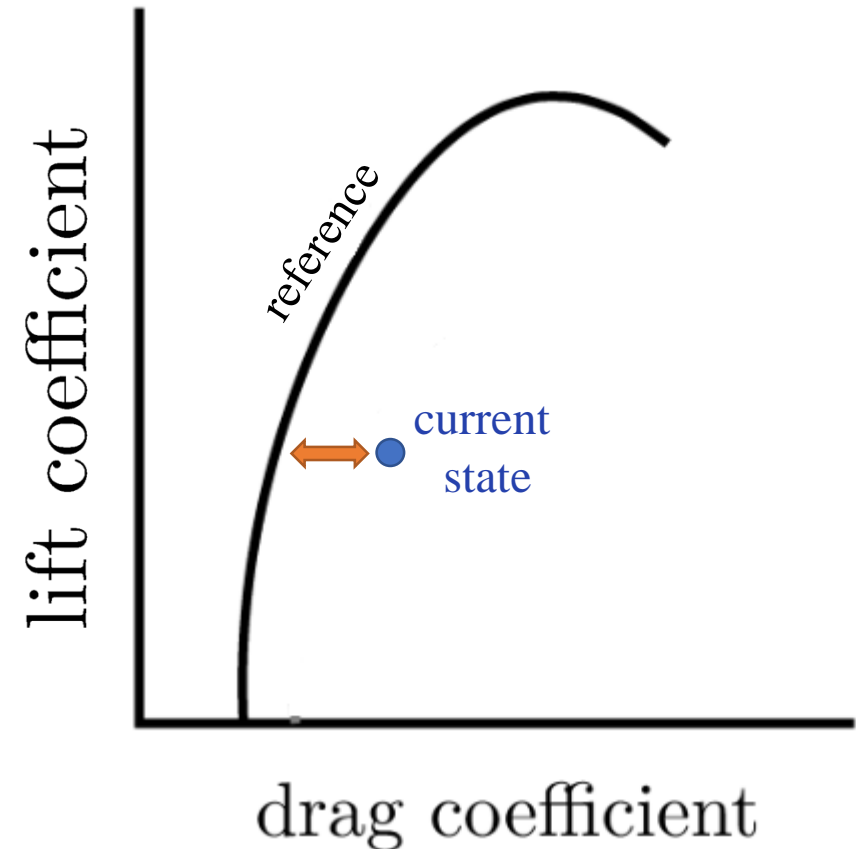
# Indirect Ice Detection System (IIDS)

- 💧 core part of the HIDS
- 💧 IIDS for a specific aircraft type, which concern
  - 💧 the flight data preprocessing: information about the current aircraft state
    - 💧 acceleration, rotational rates and attitude
    - 💧 atmospheric conditions, altitude, airspeed, inflow angles
    - 💧 engine (and propeller) state
    - 💧 aircraft configuration and weight and balance
  - 💧 the flight performance reference data base
  - 💧 the indirect ice detection threshold and confirmation times
  - 💧 the detection reliability conditions



# Flight Performance Reference Data Base

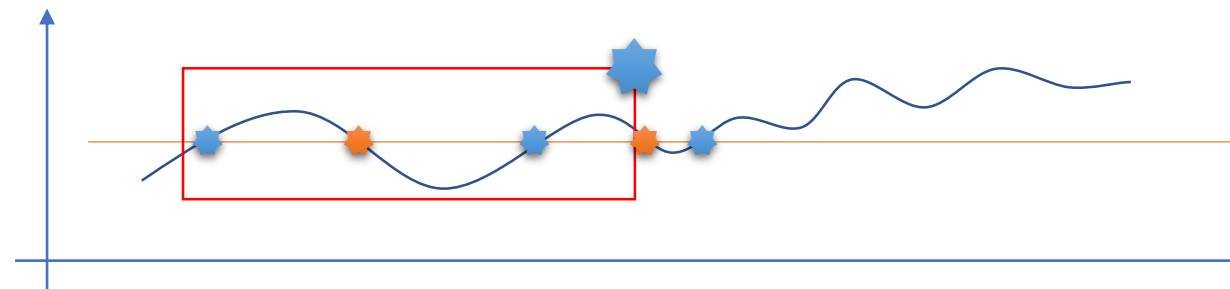
- Reference data required to compute the reference power imbalance  $\dot{E}_{tot,ref}$
- Must include the aircraft performance
  - e.g., via multi-dimensional model for  $\dot{E}_{tot,ref}$  (e.g. table)
  - aerodynamic reference and engine thrust model  
→ used for SENS4ICE
- Reference could be based on flight data or only preliminary design data for new aircraft
- For SENS4ICE flight test:
  - Specific adaption of reference required due to significant aircraft modifications





# Detection Threshold and Confirmation Time

- 💧 Abnormal flight performance
  - 💧 airframe ice accretion persistent,
  - 💧 degradation constantly increasing  
→ indirect ice detection



- 💧 Detection threshold on the equivalent drag coefficient  
→ significant degradation and critical for safe flight  
→ earlier if possible

- 💧 Detection based on relative value with based zero-lift drag coefficient  
→ nominal case: relative value 100% with additional drag coefficient is zero

- 💧 Confirmation time for detection required to prevent false alarms by measured performance fluctuations

- 💧 Weighted moving averages used for filtering and confirmation

	SAFIRE ATR 42-320	Embraer Phenom 300
detection threshold as relative drag coefficient increase	15%	10%
confirmation timeframe for detection (threshold exceeded more than 50%)	20 s	20 s
confirmation time for reset (threshold undershot more than 50%)	180 s	180 s

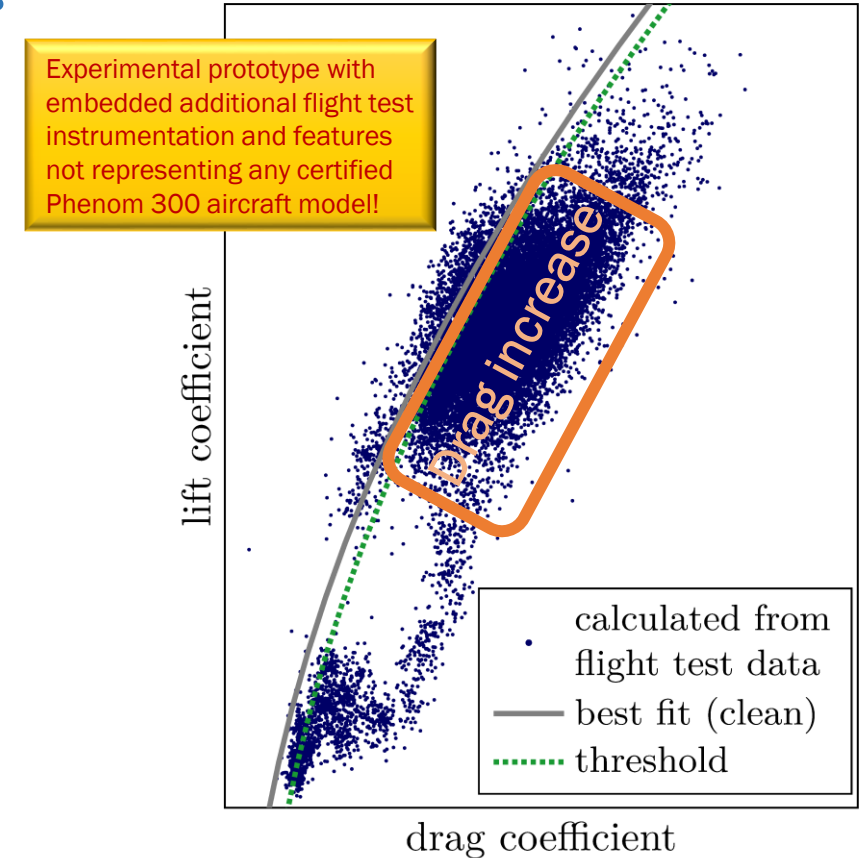


# IIDS Test Results on Icing Flight Data

- 💧 IIDS implementation in Matlab<sup>®</sup>/Simulink
- 💧 IIDS validation for SENS4ICE flight test campaign with existing App. C icing flight data for EMB Phenom 300 prototype
- 💧 Flight Data contain measurements of
  - 💧 translational accelerations
  - 💧 rotational rates
  - 💧 aircraft attitude
  - 💧 true airspeed, angle of attack, and angle of sideslip
  - 💧 geographic position and altitude
  - 💧 control surface deflections
- 💧 Relevant icing encounters extracted for IIDS validation

**NOTE:** specific flight test data excluding other sources of performance degradation!

**App. C icing encounter  
(flight data from before SENS4ICE)**

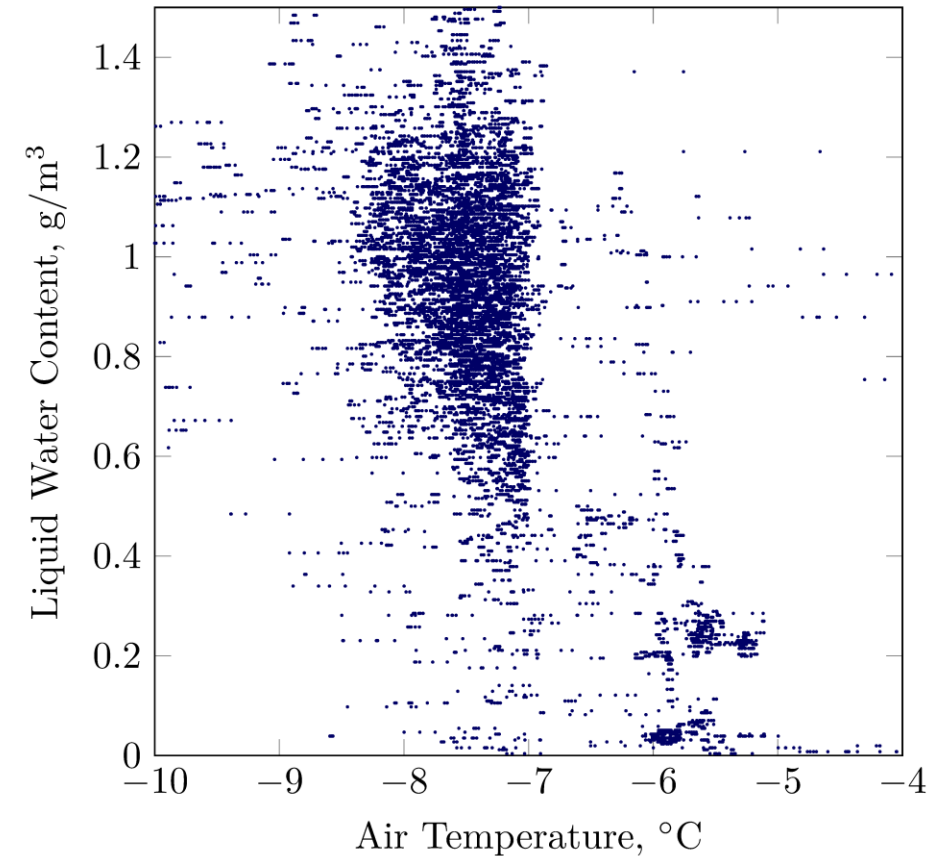
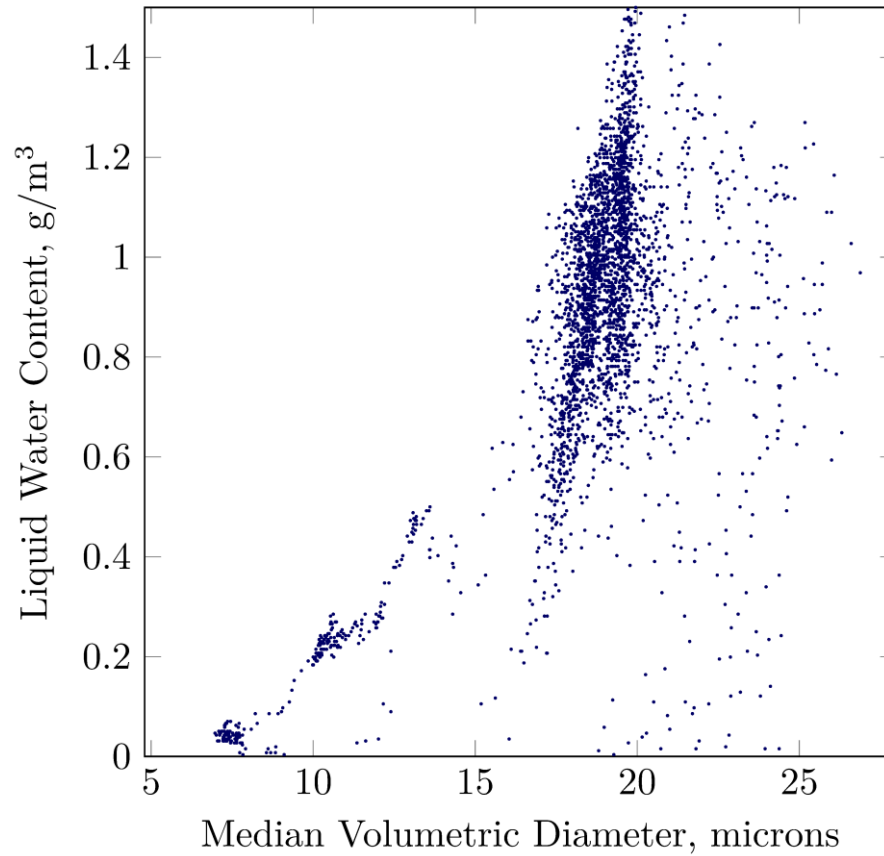


Credit: DLR



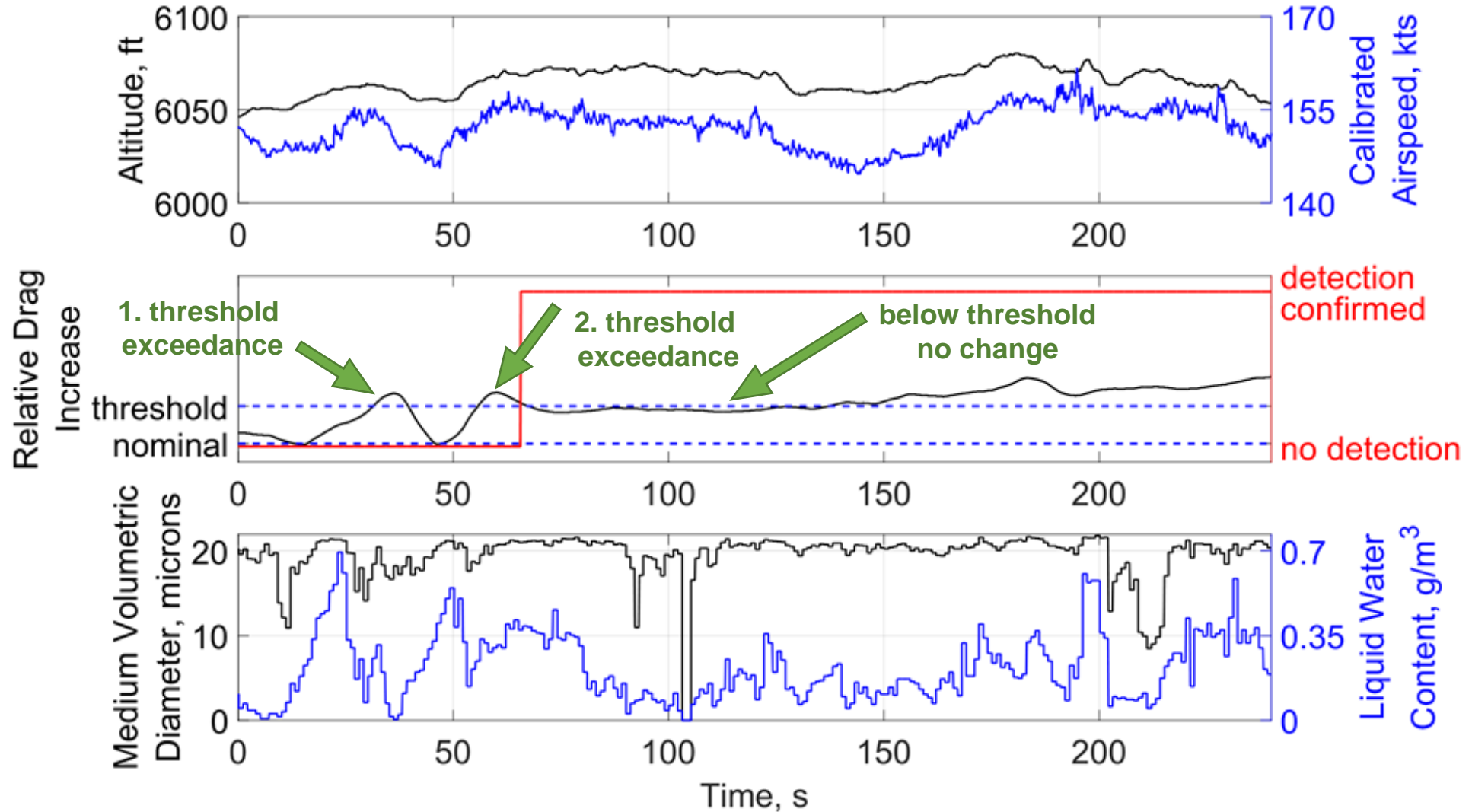
# IIDS Test Results on Icing Flight Data

Atmospheric conditions from example flight data → Appendix C icing conditions



# Example encounter

## App. C icing encounter (flight data from before SENS4ICE)



# Conclusion

- ◆ Indirect ice detection methodology based on an aircraft performance degradation  
→ one key to success for SENS4ICE
- ◆ several advantages compared to direct detection (mainly complementary), e.g.,
  - ◆ retrofit capabilities
  - ◆ simple software solution
  - ◆ highly beneficial information about the remaining aircraft capabilities → safe exit strategy
- ◆ IIDS provides redundancy for ice detection when hybridized  
→ reduced risk for common cause failures
- ◆ Methodology requires precise measurements of flight condition  
→ normally available for modern aircraft
- ◆ Verification & validation of IIDS based on ATR 42 and EMB Phenom 300 flight data:
  - ◆ IIDS design verification (clean air data)
  - ◆ IIDS detection validation with natural icing flight test data (App. C) for Phenom 300
- ◆ IIDS tuning for flight test campaigns according to given results
- ◆ Next step: SENS4ICE flight test campaign evaluation regarding IIDS performance



# Further Application of Performance-Based Ice Detection beyond SENS4ICE

- ◆ IIDS opens up various new possibilities for the ice detection on smaller aircraft
- ◆ Basic icing effects on flight performance similar respectively worse for small size vehicles, e.g., UAV
  - faster performance degradation with significantly reduced capabilities and remaining envelope
- ◆ Advantages for UAV ice detection
  - ◆ performance degradation due to ice accretion measurable during all flight phases including rapid maneuvering
  - ◆ valuable information about flight envelope limitation directly available
- ◆ Transfer of methodology to, e.g., UAV icing requires additional (vehicle specific) research, but provides a significant potential for (low cost / effort) ice detection



# Imprint

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Institute: Institute of Flight Systems

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