



# CCRES

Scientific and technical highlights

3 presentations:

B. Pospichal, Universität zu Köln  
W. Schimmel, Universität Leipzig  
M. Hajipour, TROPOS

*CCRES Workshop, Online – May 3-5<sup>th</sup>, 2022*



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# Observations of the wind profile using Doppler lidar and Doppler cloud radar

Bernhard Pospichal, Marcus Müller, Stefan Kneifel

Universität zu Köln



# Motivation

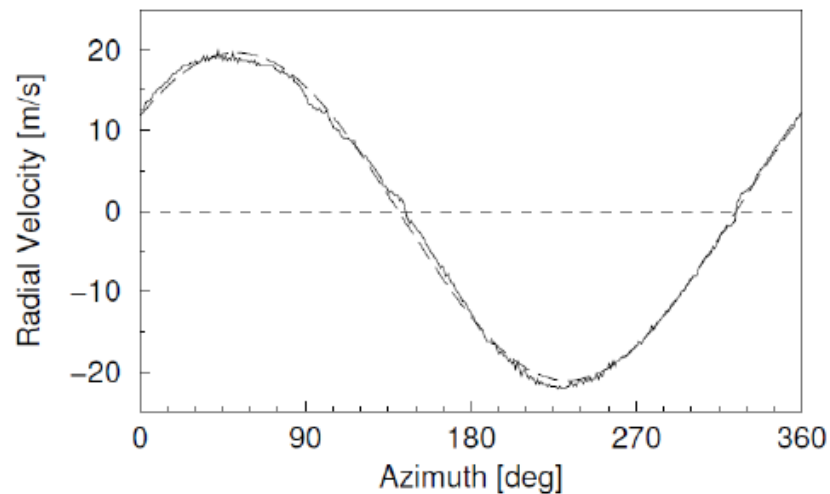
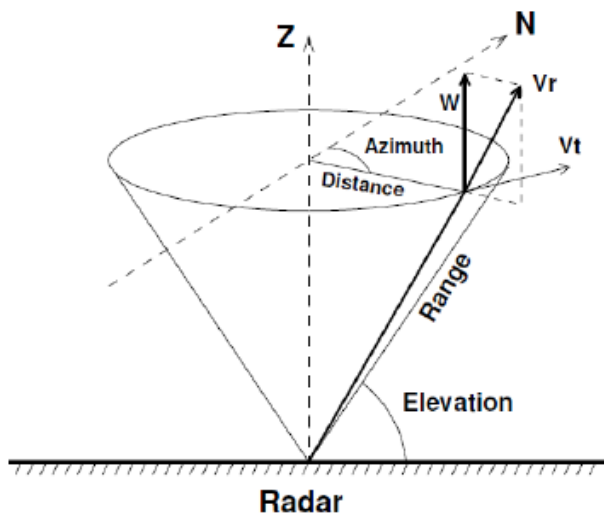
- Profiles of the horizontal wind can be obtained by ground-based remote sensing
  - Radar wind profiler (RWP)
  - Doppler wind lidar (DWL)
  - Doppler cloud radar (DCR)



➤ **ACTRIS cloud remote sensing network can provide wind profiles (DWL, DCR)**

# Wind profiles - Methodology

- 3D wind vector can be derived from off-zenith azimuth scans by analyzing the Doppler shift along the line of sight („VAD scan“ Velocity Azimuth Display)



Holleman et al., 2005

# Methodology

- Detection needs tracers that float with the air flow
  - RWP: Clear-air fluctuations of the refractive index (Bragg scattering)
  - DCR tracers: Cloud particles, Insects
  - DWL tracers: Aerosols
- **Problems/Limitations:**
  - Absence of tracers
  - Fall speed of particles (esp. rain)
  - Own movement of tracers (insects)
  - Attenuation of signal (esp. by clouds for DWL)
  - Assumption of homogeneous wind field (turbulence)
- **Combination of methods (DCR+DWL) increases coverage**



# Combined product for wind profiles

- **Doppler lidar VAD scan**

- zenith angle 15°, every 15 minutes
- 10 degrees angular resolution, spatial resolution 30 m

- **Cloud radar VAD scan**

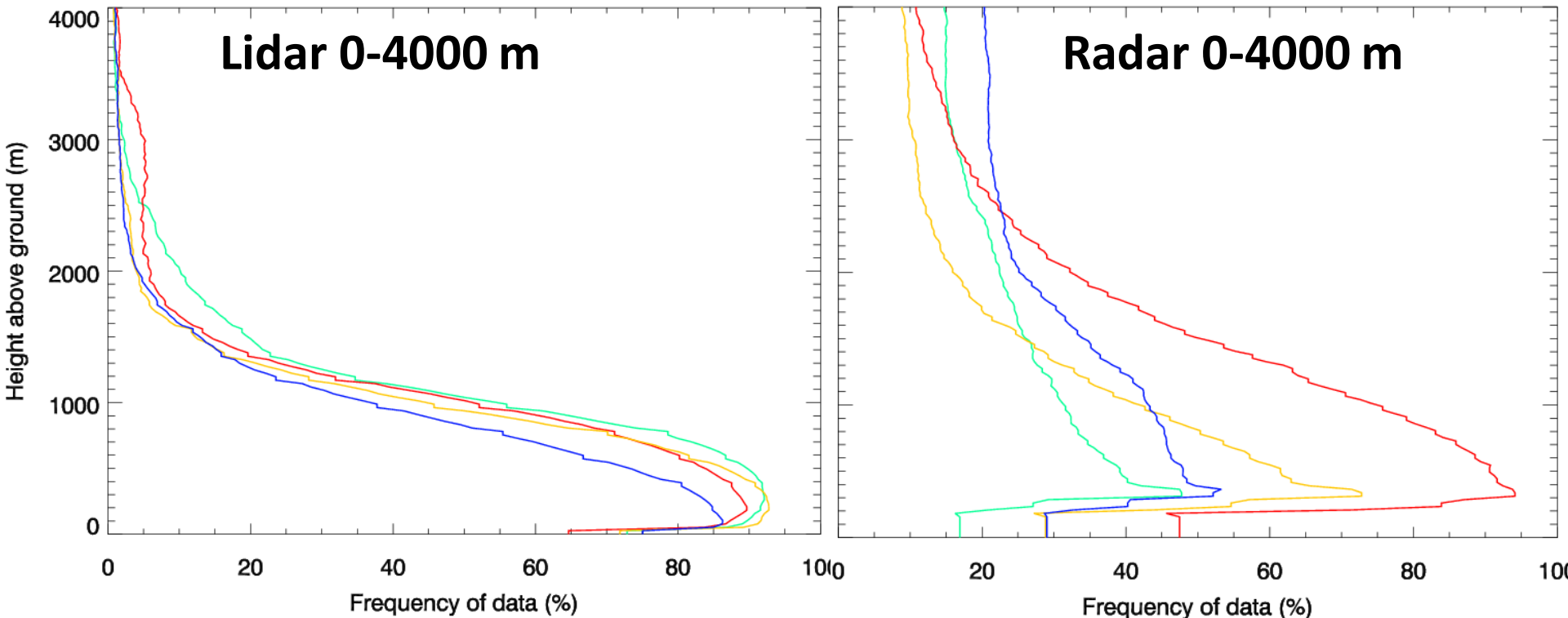
- zenith angle 8°, every 30 minutes
- ~5 degrees angular resolution, spatial resolution 30 m

- **Combined product**

- if both methods are available, a weighted mean of both speed and direction is used depending on the uncertainty of the fit
- 26 m vertical resolution, 30 min temporal resolution

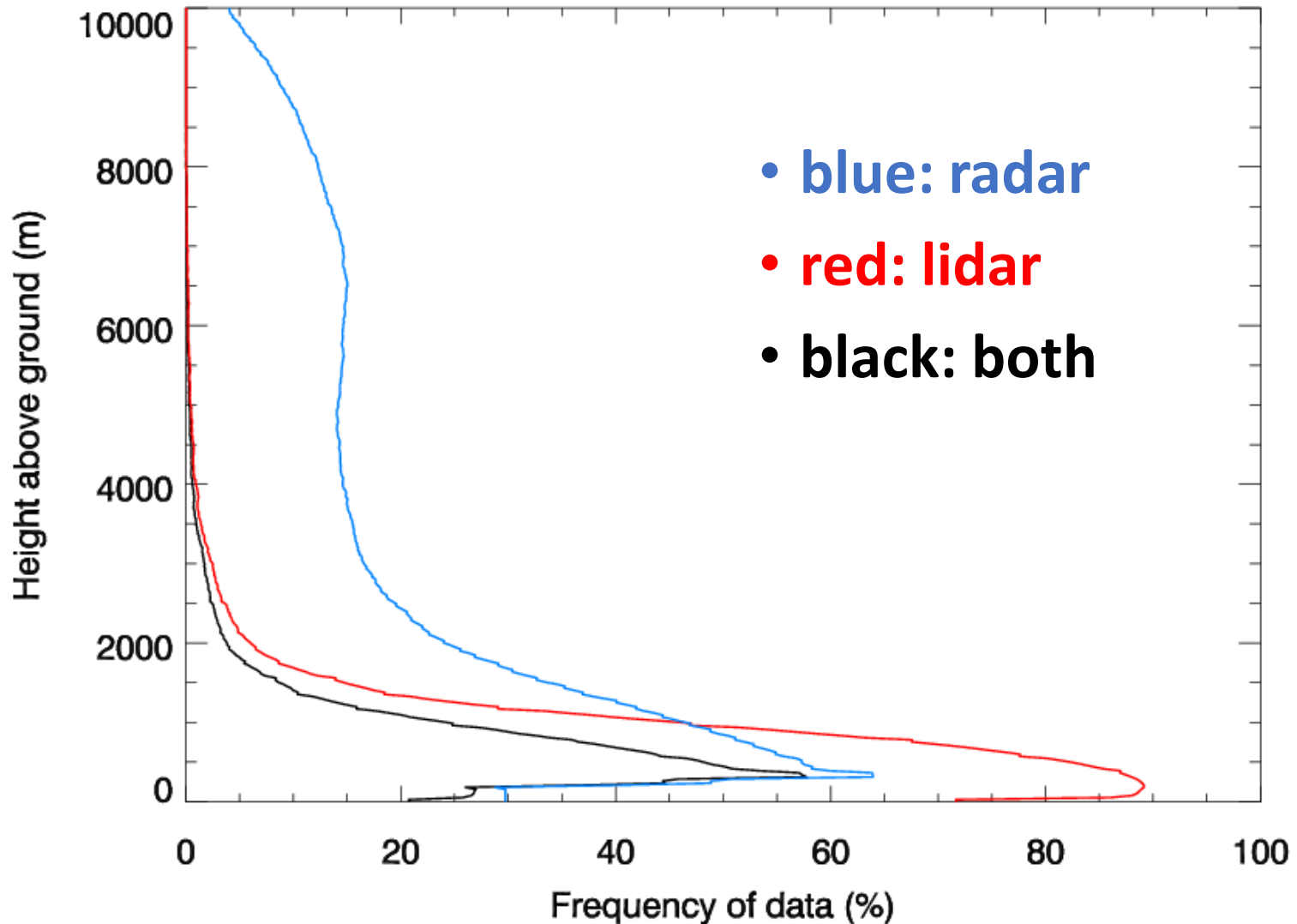
2 years of observations at JOYCE (Jülich Observatory for Cloud Evolution)

# Data availability per season



**blue: winter, green: spring, red: summer, yellow: fall**

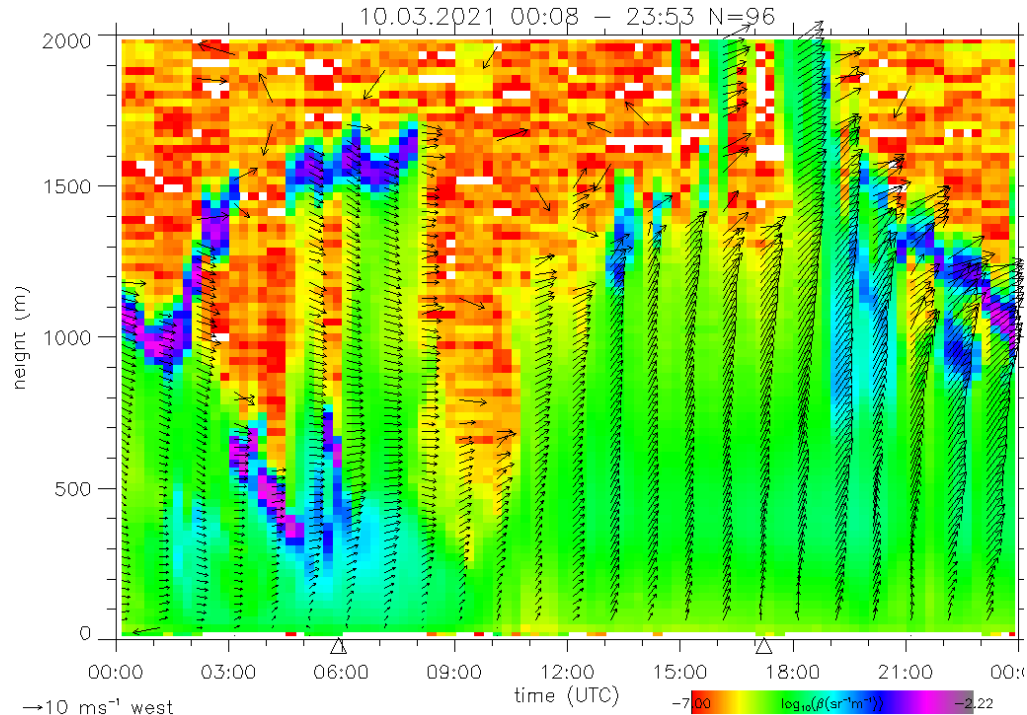
# Data availability



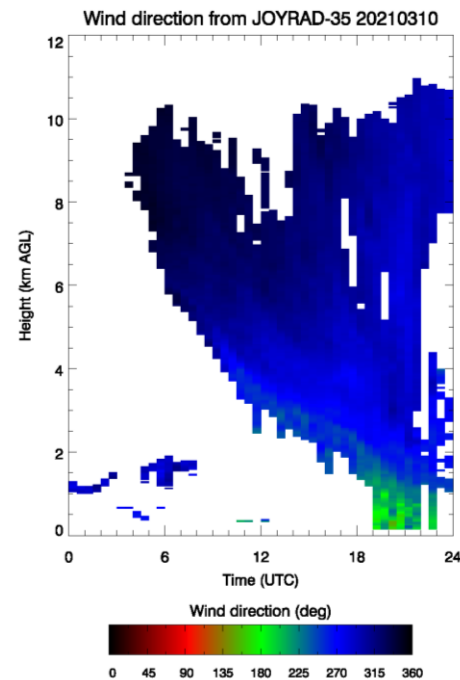
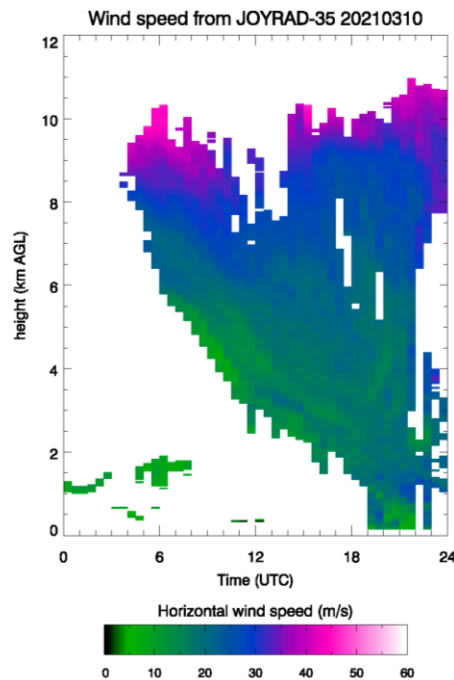


# Example day 10.03.2021

- Wind lidar (0-2 km)

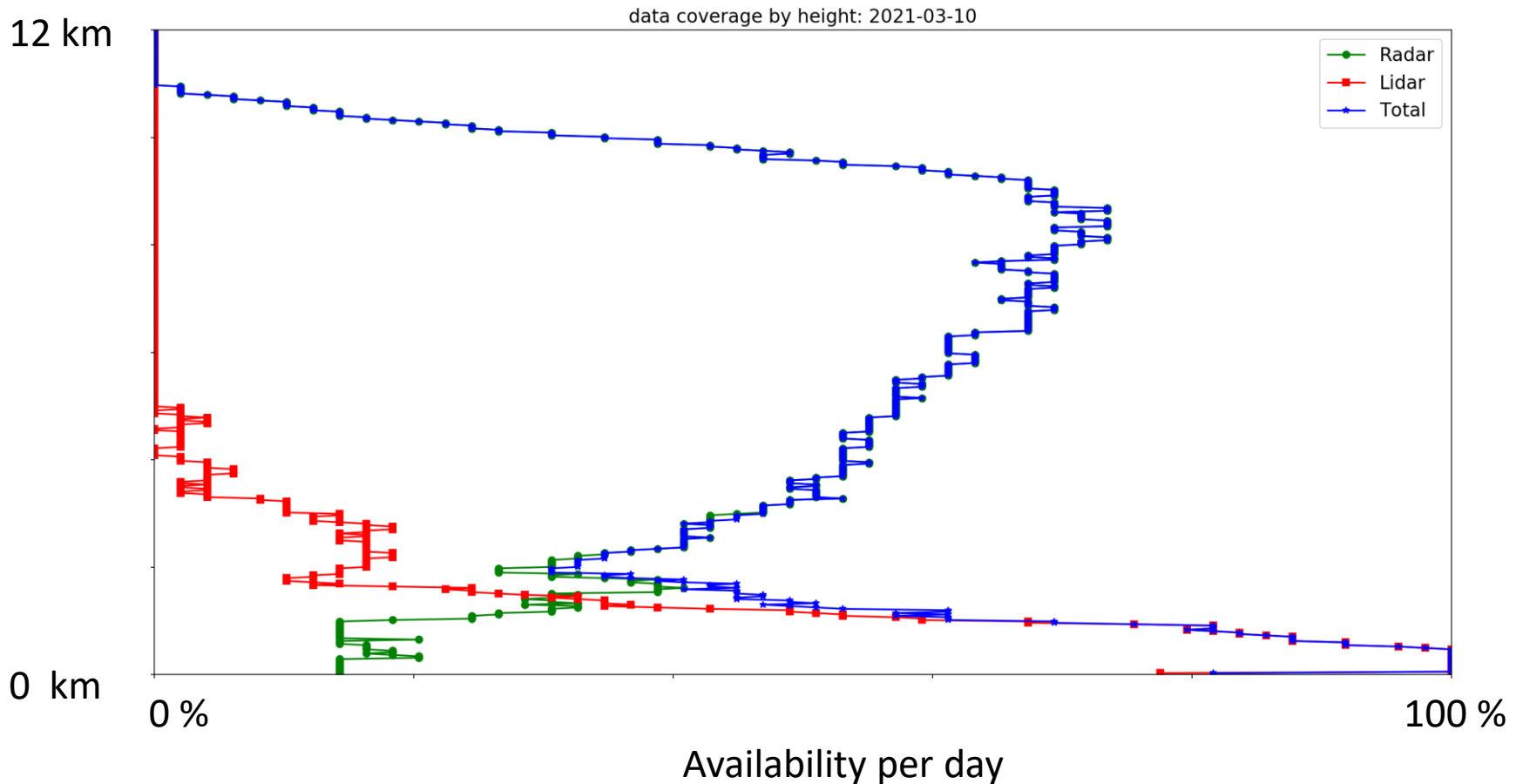


- Cloud radar (0-12 km)



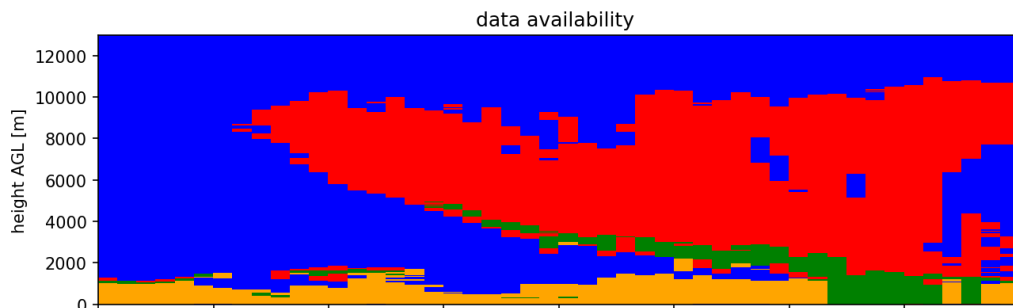
# Example day 10.03.2021

- Data availability vs. height

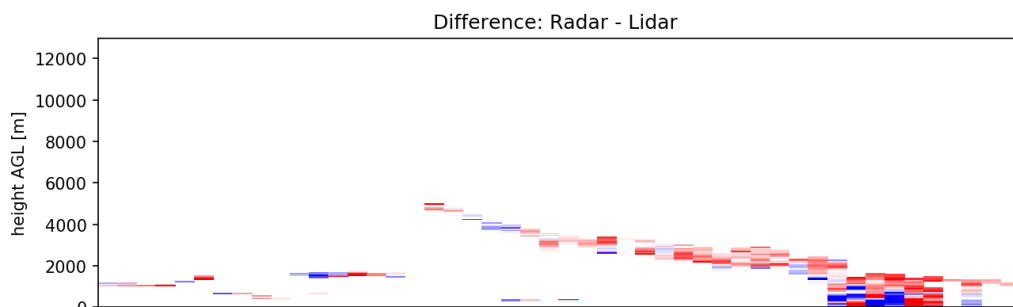


# Example day - Wind direction

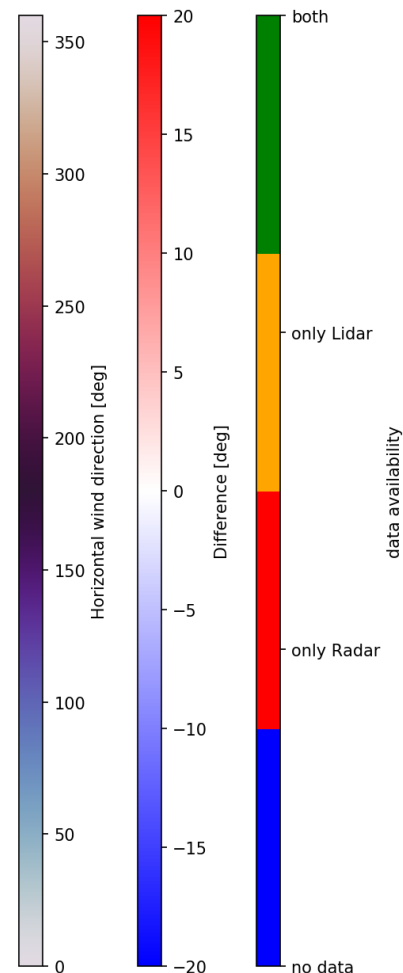
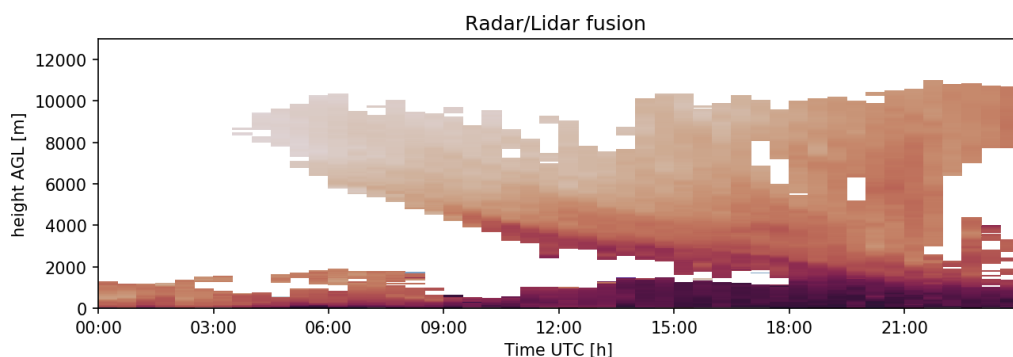
availability



difference  
radar-lidar

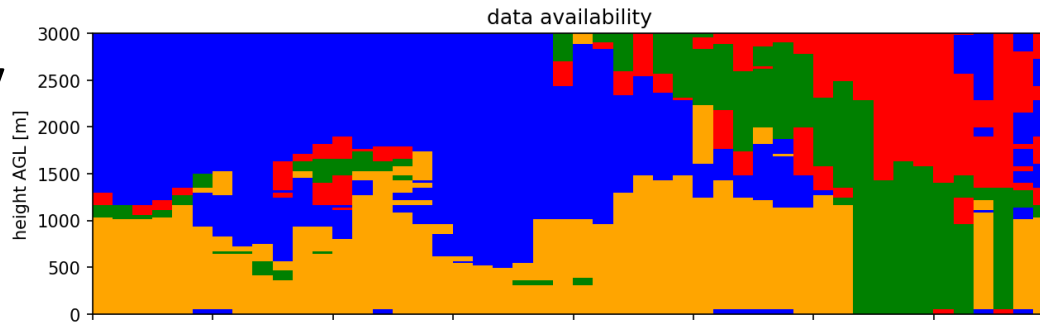


fusion

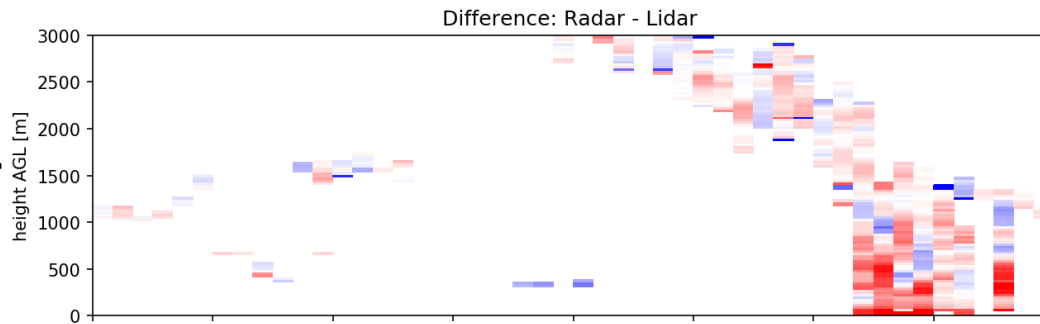


# Example day - Wind speed boundary layer

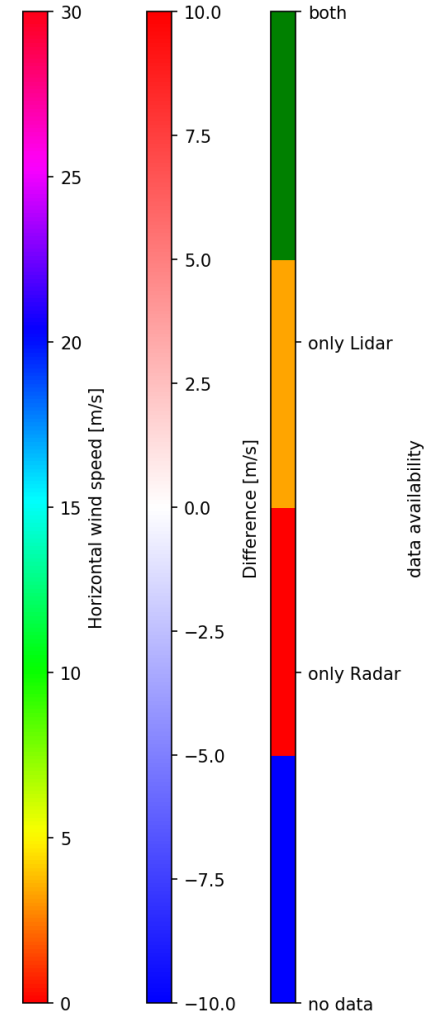
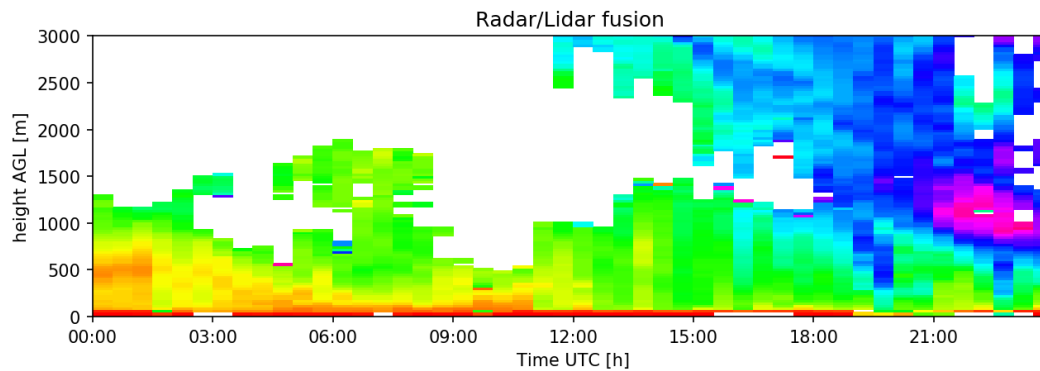
availability



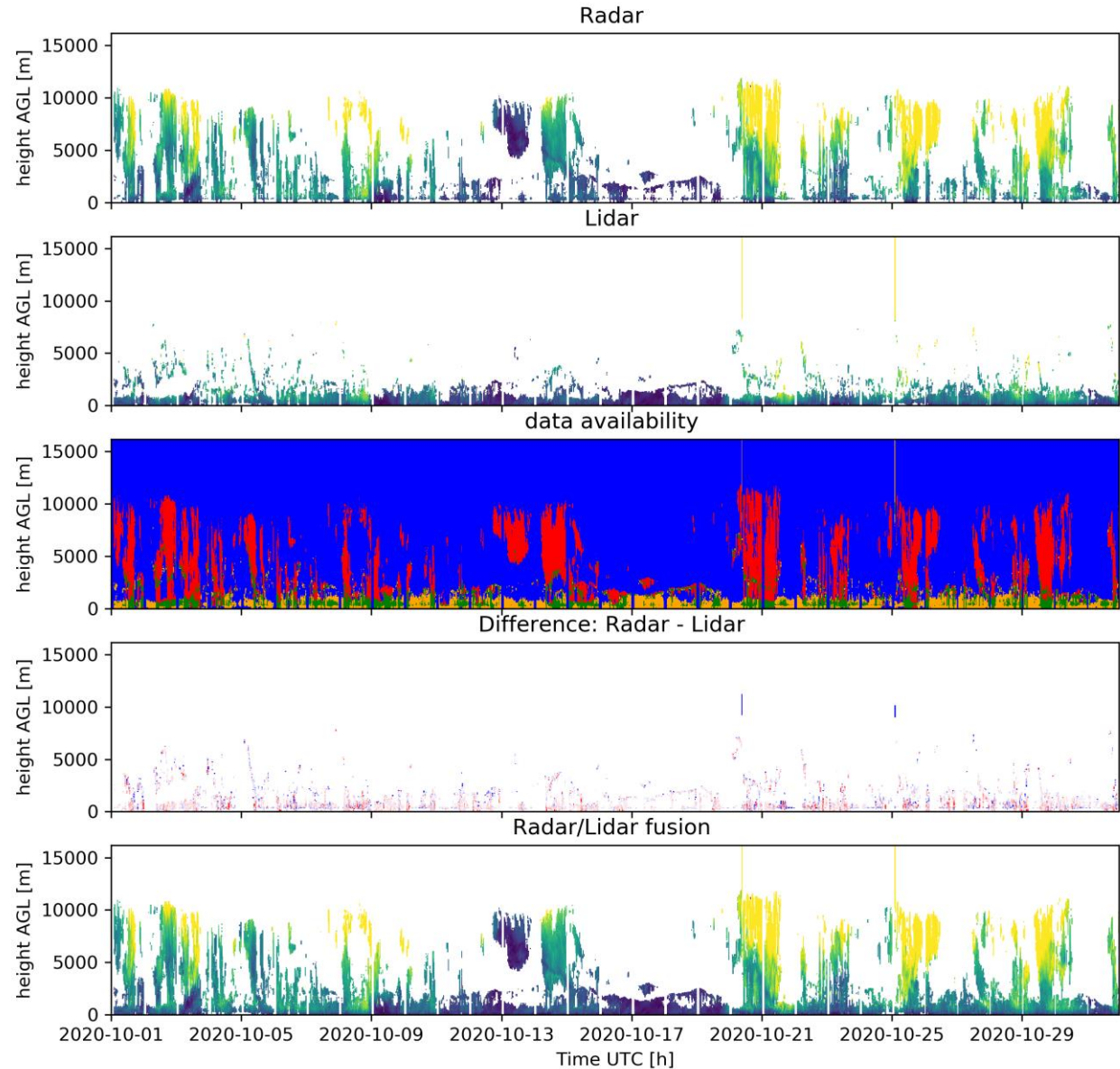
difference  
radar-lidar



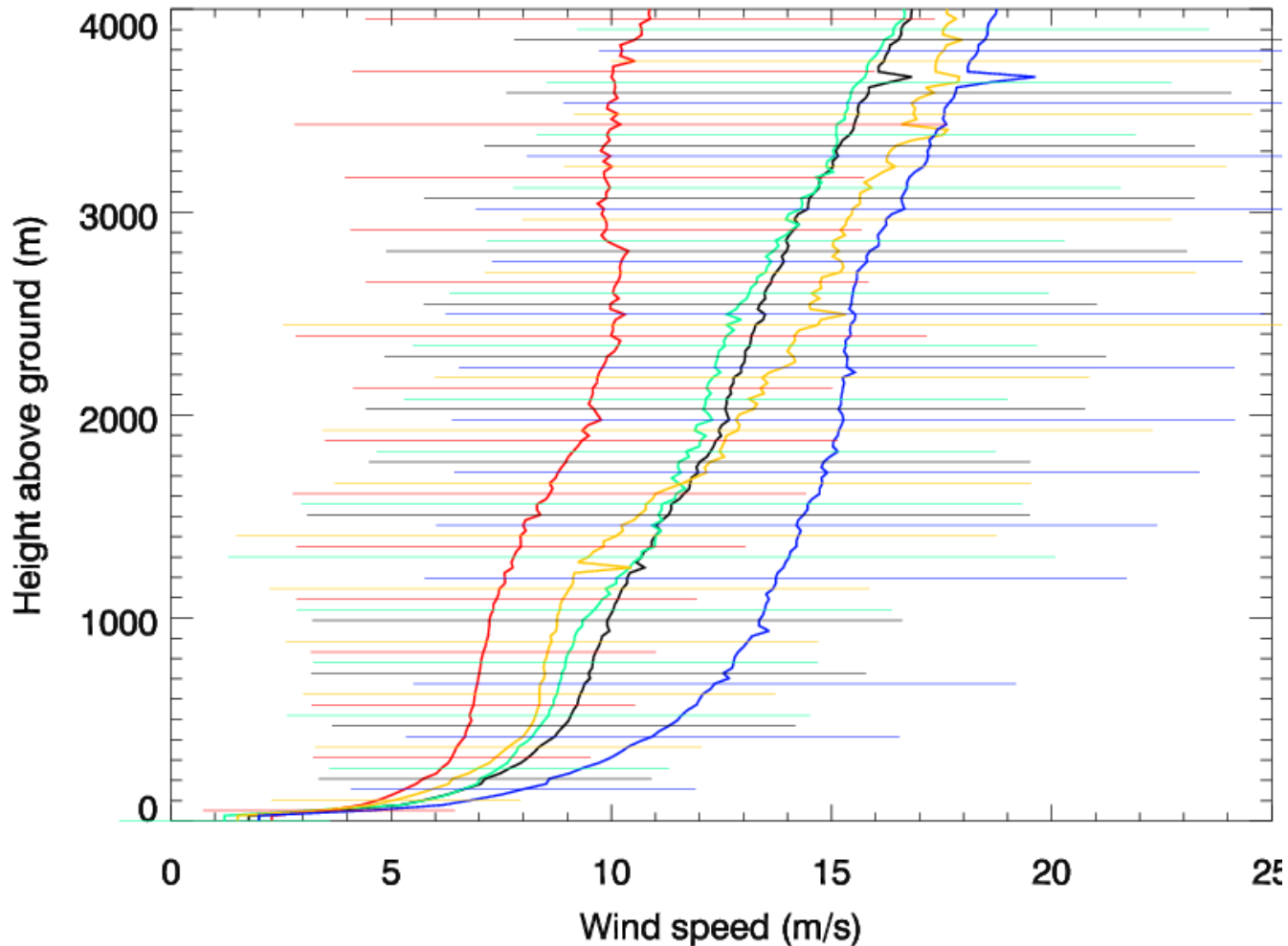
fusion



# monthly overview

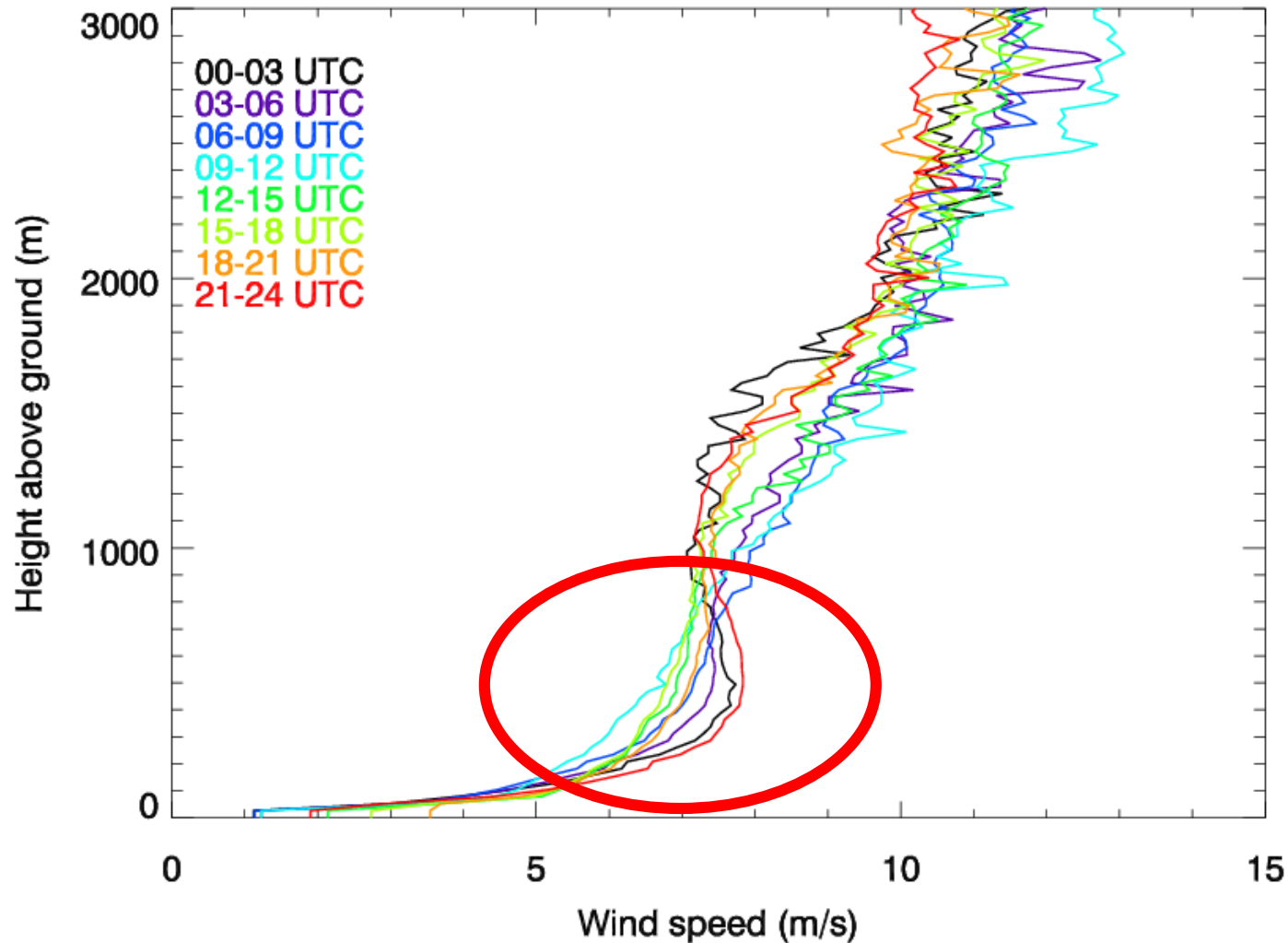


# Statistics: Mean horizontal wind speed per season

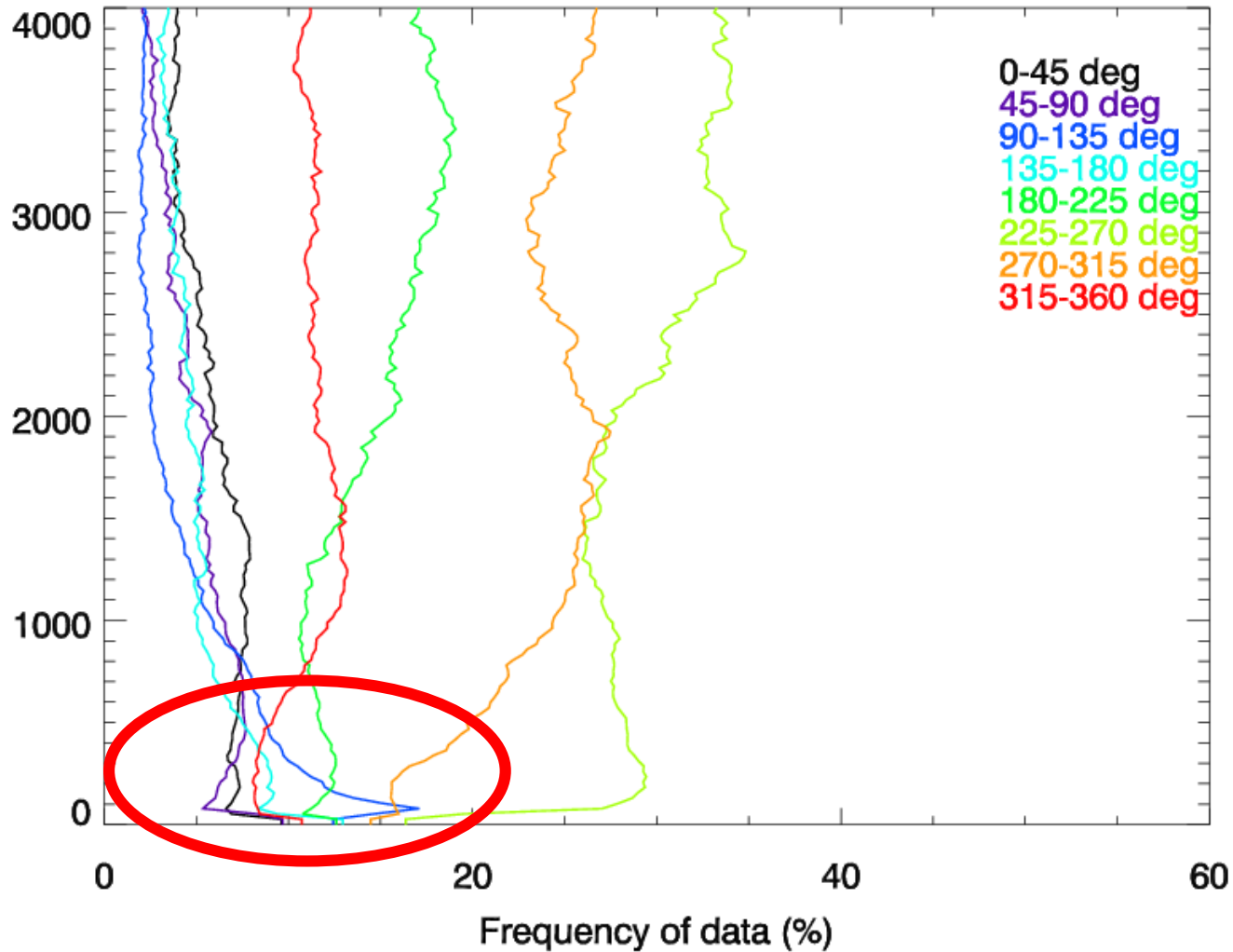


**blue: winter, green: spring, red: summer, yellow: fall, black: all**

# Statistics: Diurnal cycle of wind



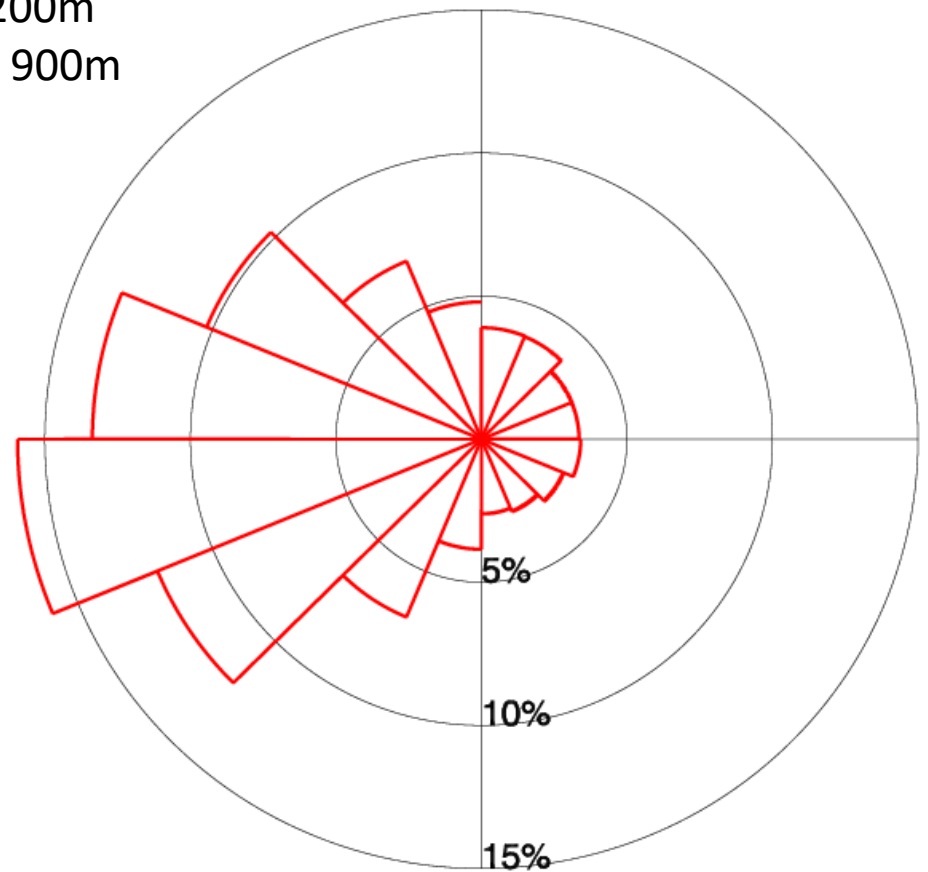
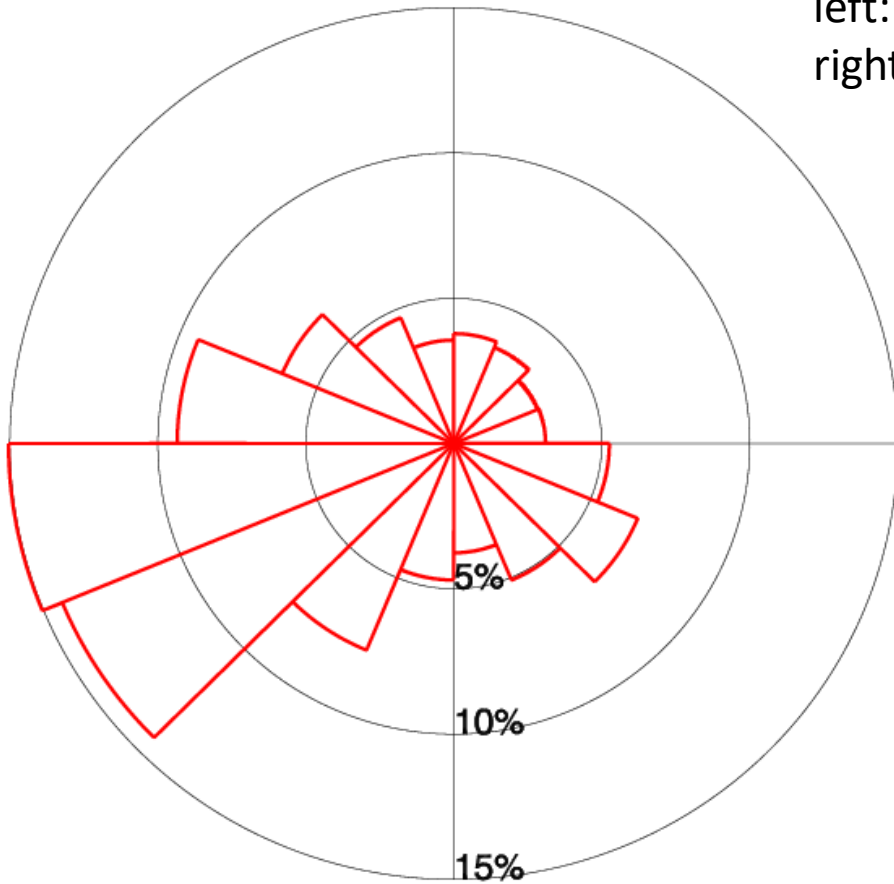
# Wind direction profiles





# Wind roses

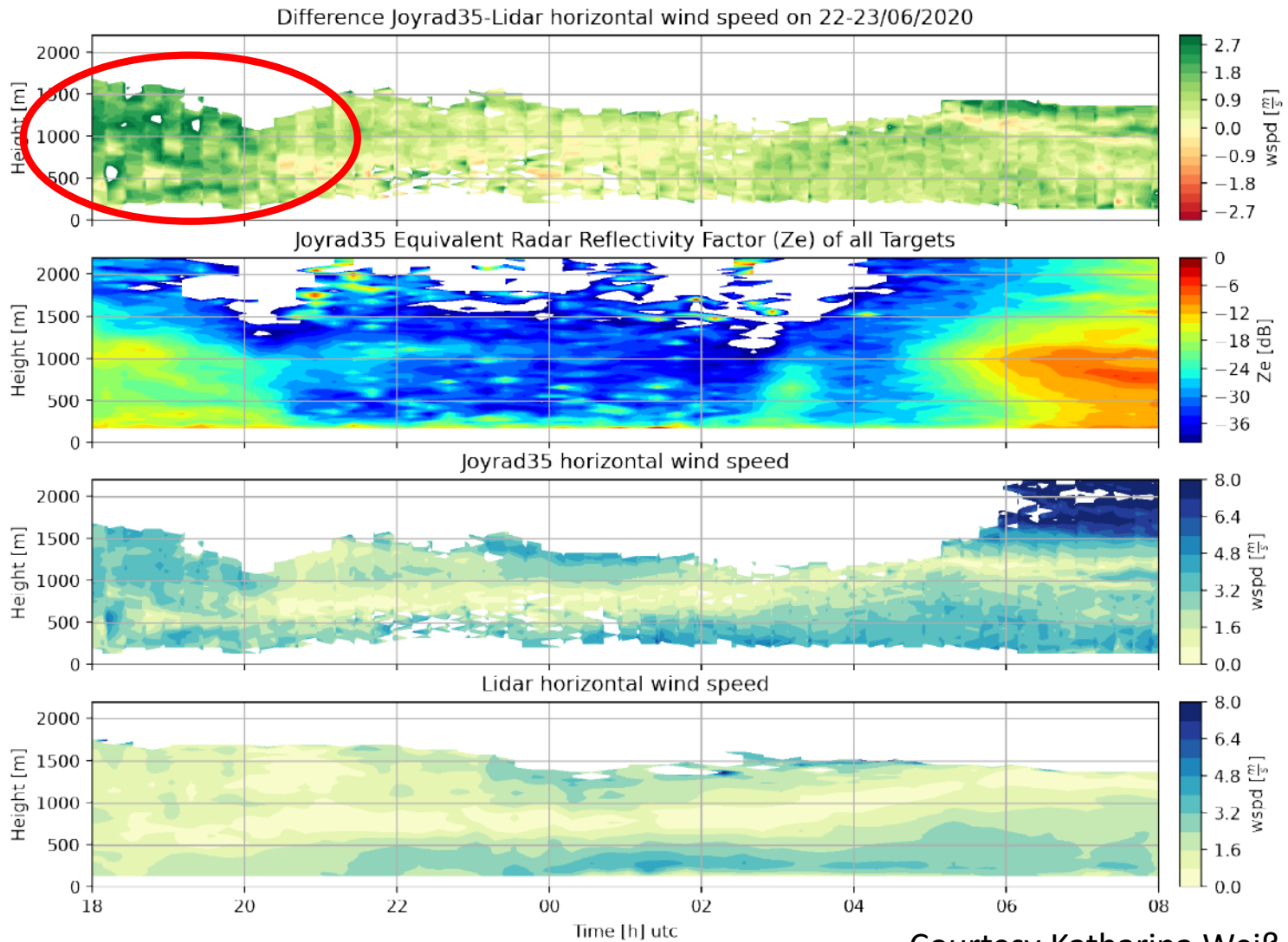
left: 200m  
right: 900m



# Application: Insect detection

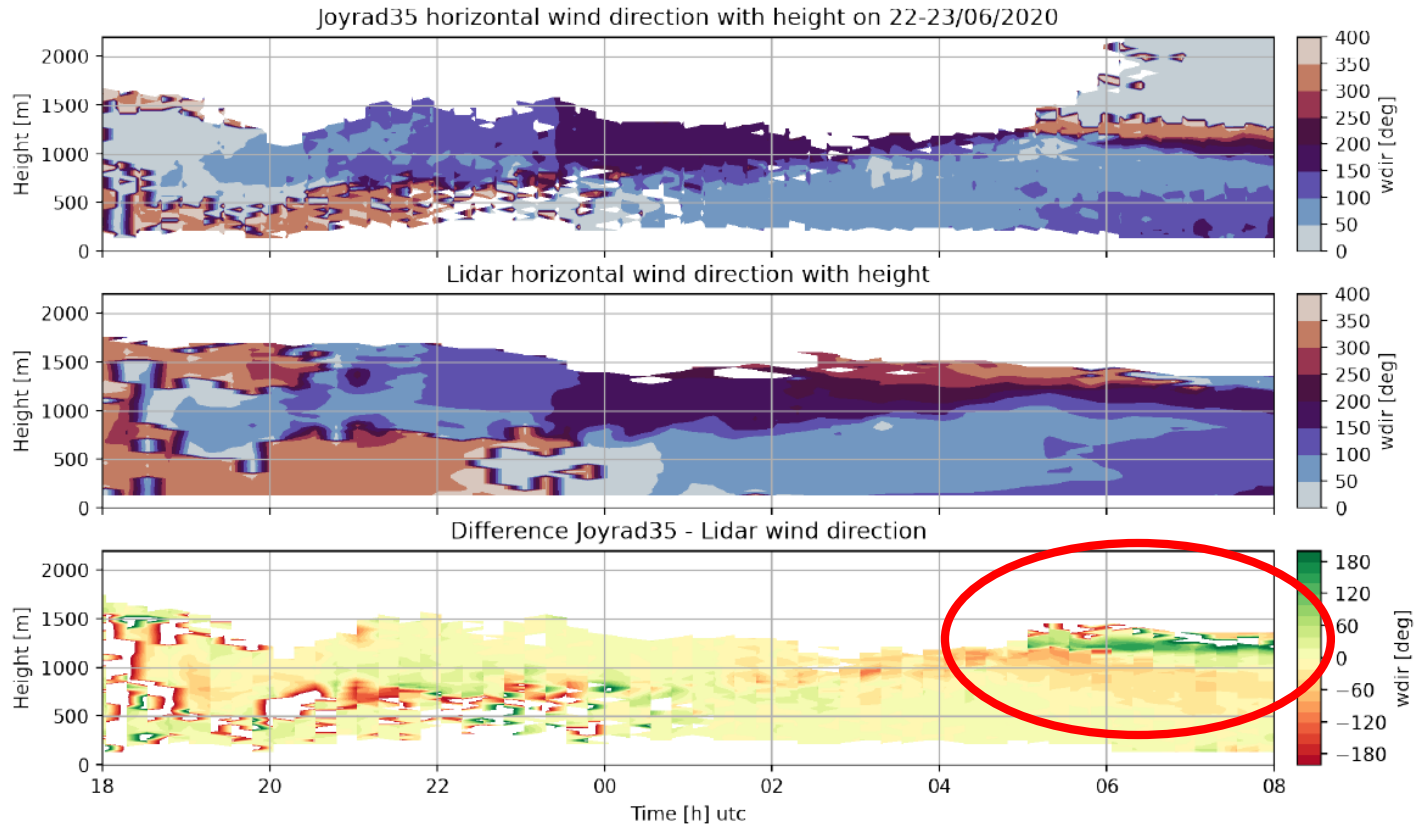
- Insects are efficient targets to produce radar backscatter due to their size (1mm-1cm)
- Lidar backscatter is not affected by insects
- During warm periods (roughly  $T > 10^{\circ}\text{C}$ ), the Doppler radar signal is dominated by insects
- Comparison between radar and lidar allows the detection of insects and their speed

# Insect detection



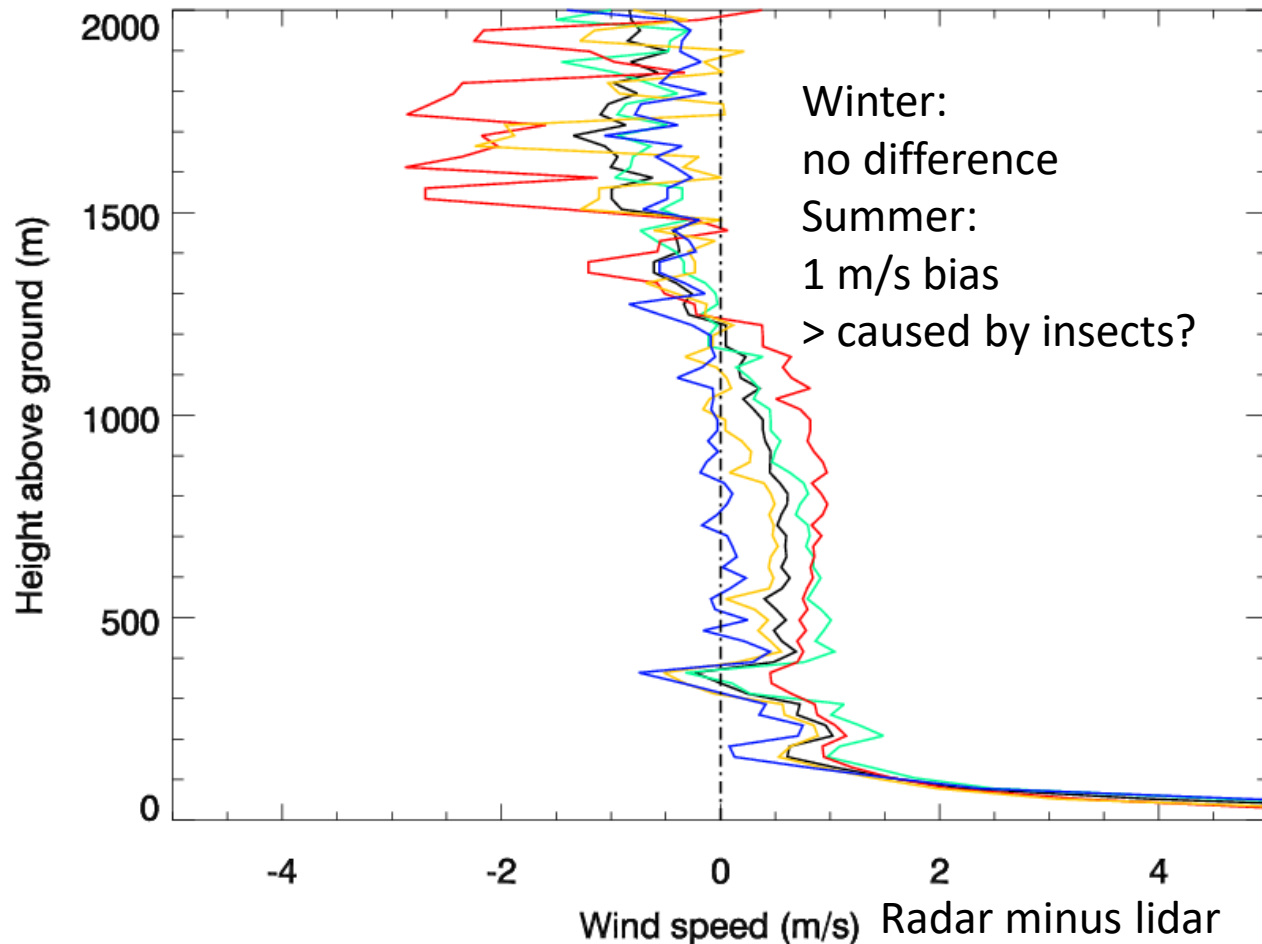
Courtesy Katharina Weiß

# Insect detection



Courtesy Katharina Weiß

# Difference wind speed



**blue: winter, green: spring, red: summer, yellow: fall, black: all year**

# Summary

- Wind profiles with a temporal resolution can be derived from a combination of Doppler lidar and Doppler cloud radar
- Synergy gives better coverage than for single instruments
- Future: New product for ACTRIS Cloudnet stations
- Several applications
  - Satellite validation
  - Insect detection
  - Model evaluation

**Thank you !**





UNIVERSITÄT  
LEIPZIG



Leipzig Institute for Meteorology

# VOODOO: REVEALING SUPERCOOLED LIQUID BEYOND LIDAR ATTENUATION

from vertically-pointing cloud radar observations  
using artificial neural networks

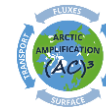
ACTRIS Talk

May 5, 2022

W. Schimmel, H. Kalesse-Los,

T. Vogl, M. Maahn, A. Foth,

P.S. Garfia, P. Seifert\*



Europäische Union

Europa fördert Sachsen.  
ESF  
Europäischer Sozialfonds



Diese Maßnahme wird mitfinanziert durch Steuermittel  
auf Grundlage des von den Abgeordneten des Sächsischen  
Landtags beschlossenen Haushaltes.



## Ground-based Radar-Lidar Synergy

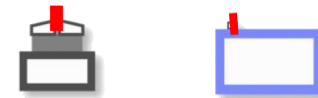
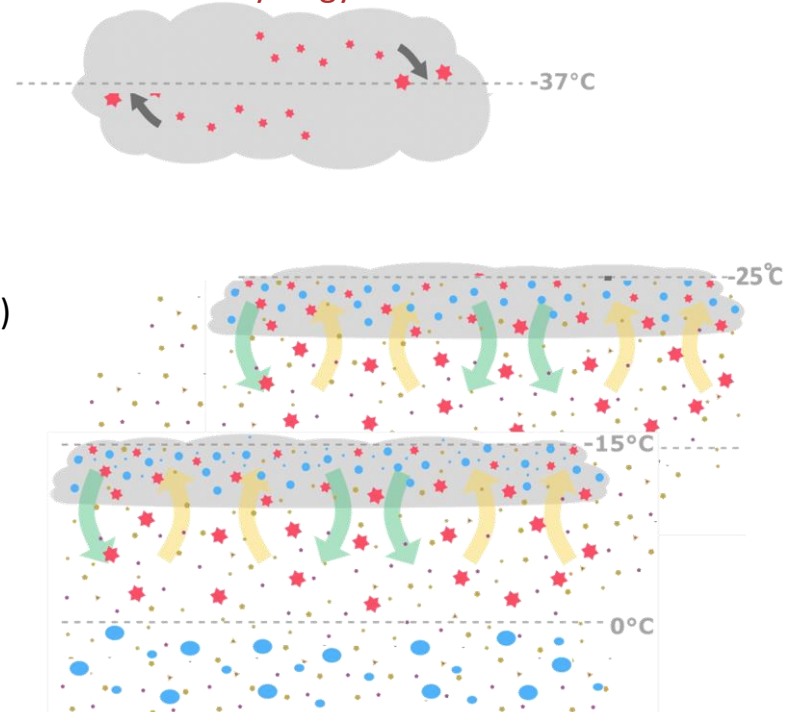
## How to quantify the thermodynamic phase of clouds?

### Lidar

- profiles of attenuated backscatter (& depolarization)
- most sensitive to numerous small liquid droplets:  
attenuated backscatter coefficient:  $\beta \sim N, D^2$
- full signal attenuation at optical depth:  $\tau \sim 3$

### Doppler cloud radar

- spectral profiles of reflectivity and radial velocity
- most sensitive to large ice crystals:  
equivalent radar reflectivity:  $Z_e \sim N, D^6$
- able to penetrate optically thick cloud layers



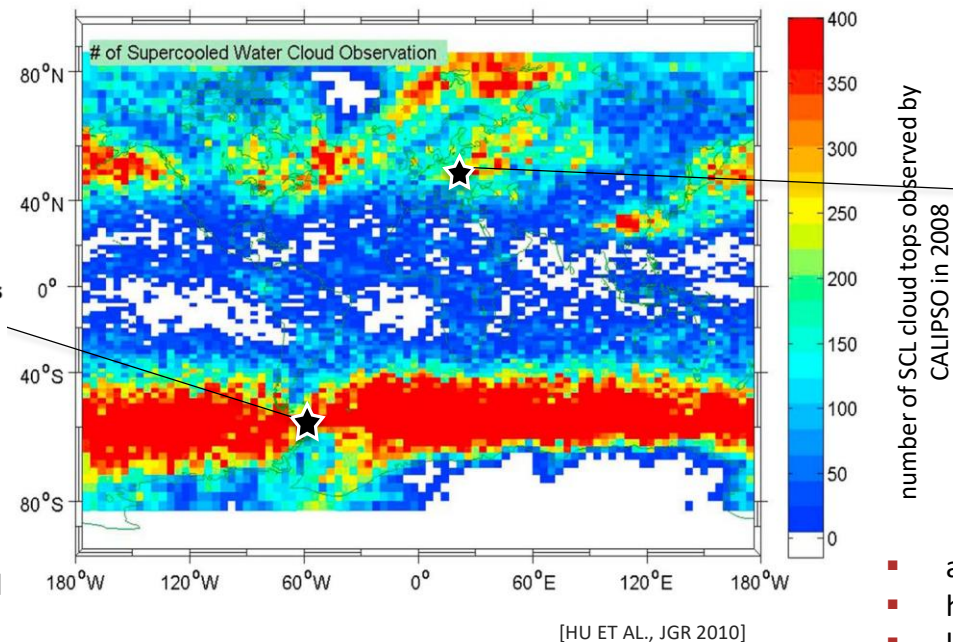
Observations from Punta Arenas, Chile and Leipzig, Germany



**D**ynamics, **A**erosol, **C**loud  
and **P**recipitation **O**bservations  
in the  
**P**ristine **E**nvironment  
of the **S**outhern **O**cean

- pristine environment
- low INP concentrations
- large amounts of supercooled liquid water
- influenced by gravity waves [Radenz et al. ACP 2021]
- W-band observations Nov 2018 - Sep 2019

Number of supercooled liquid tops as observed by CALIPSO in 2008



[HU ET AL., JGR 2010]

number of SCL cloud tops observed by CALIPSO in 2008



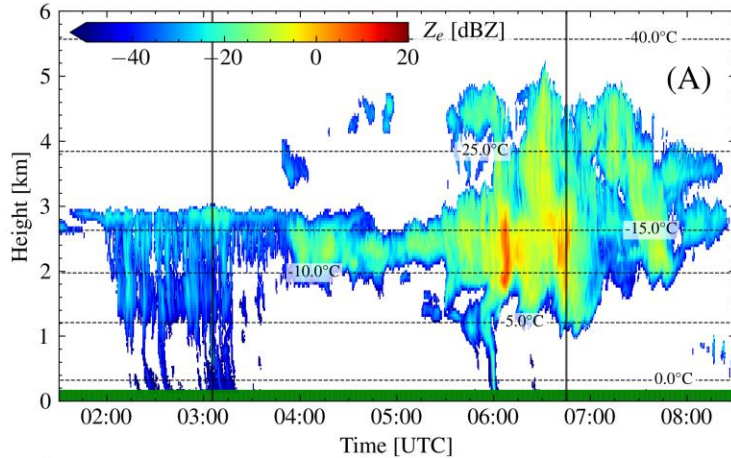
Leipzig Institute for Meteorology

- anthropogenic pollutions
- high INP concentrations
- large amounts of supercooled liquid water
- observations Dez 2020 - Mar 2022

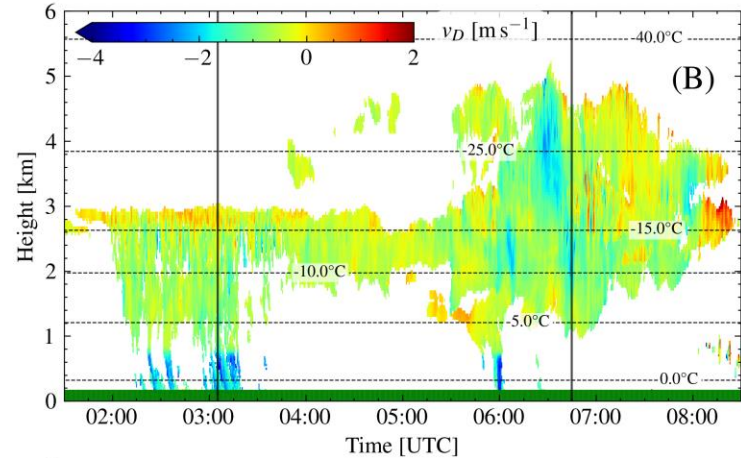
*SCL ... supercooled liquid*  
*INP ... ice nucleating particles*

Case study from 1. August 2019, Punta Arenas, Chile

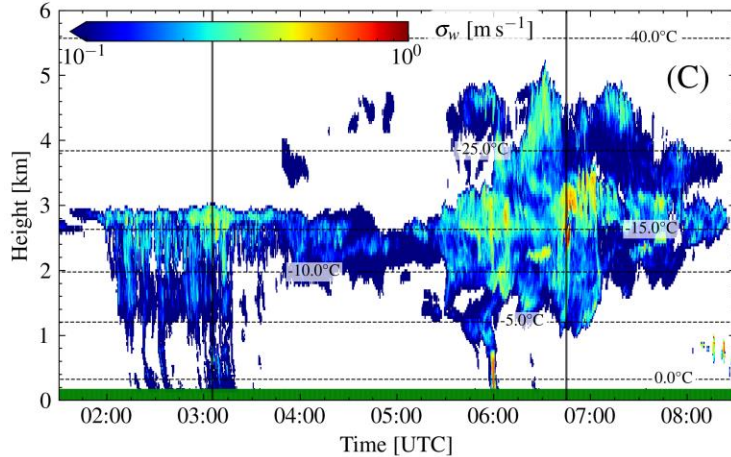
radar  
 $Z_e$



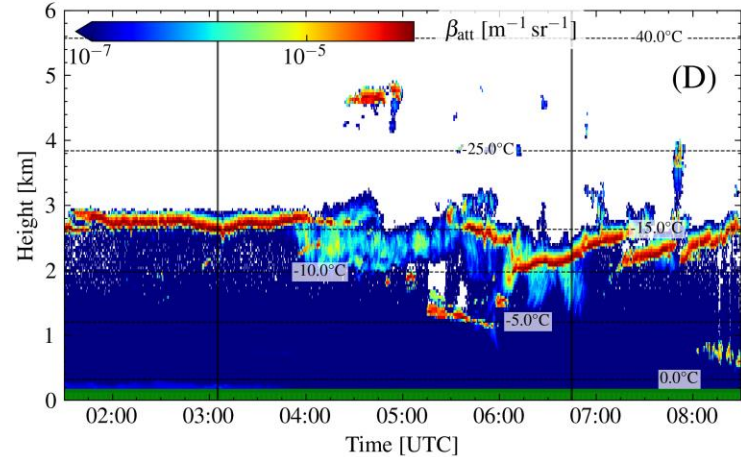
radar  
 $v_D$



radar  
 $\sigma_w$



lidar  
 $\beta_{att}$



## Hydrometer Classification: Cloudnet



Synergistic retrieval, producing cloud properties at high temporal and vertical resolution

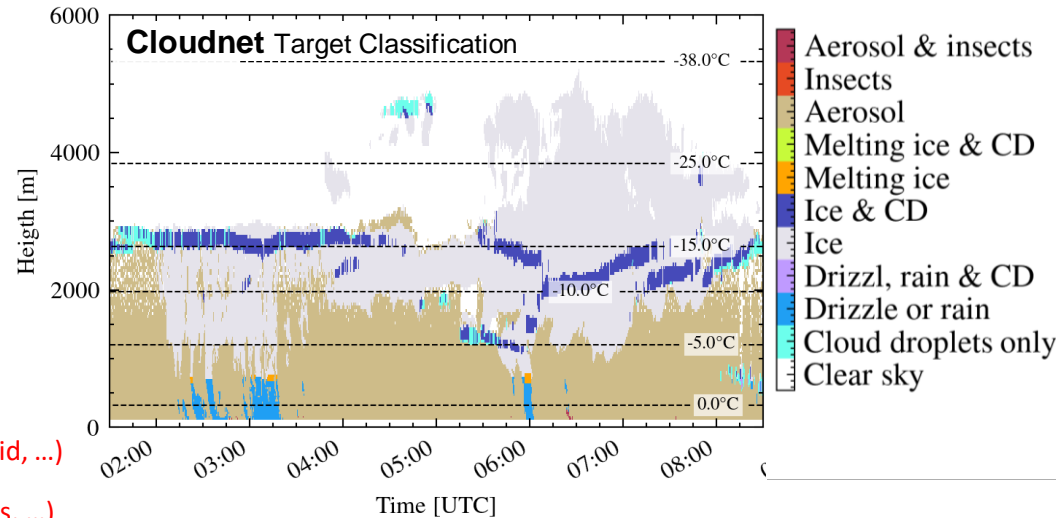
[Illingworth et al. BAMS 2007, Tukiainen et al. 2020]

### required instruments:

- Doppler Cloud Radar (moments)
- Lidar (attenuated backscatter)
- Microwave Radiometer (LWP, IWV)
- *Model data: ECMWF (temperature, pressure)*

### retrieved products:

- categorization (averaged profiles, common grid, ...)
- **atmospheric target classification (aerosol, ice, liquid, ...)**
- **quality control flag (instrument availability, corrections, ...)**



LWP ... liquid water path

IWV ... integrated water vapor

ECMWF ... European Centre for Medium-Range Weather Forecasts

GDAS ... Global Data Assimilation System

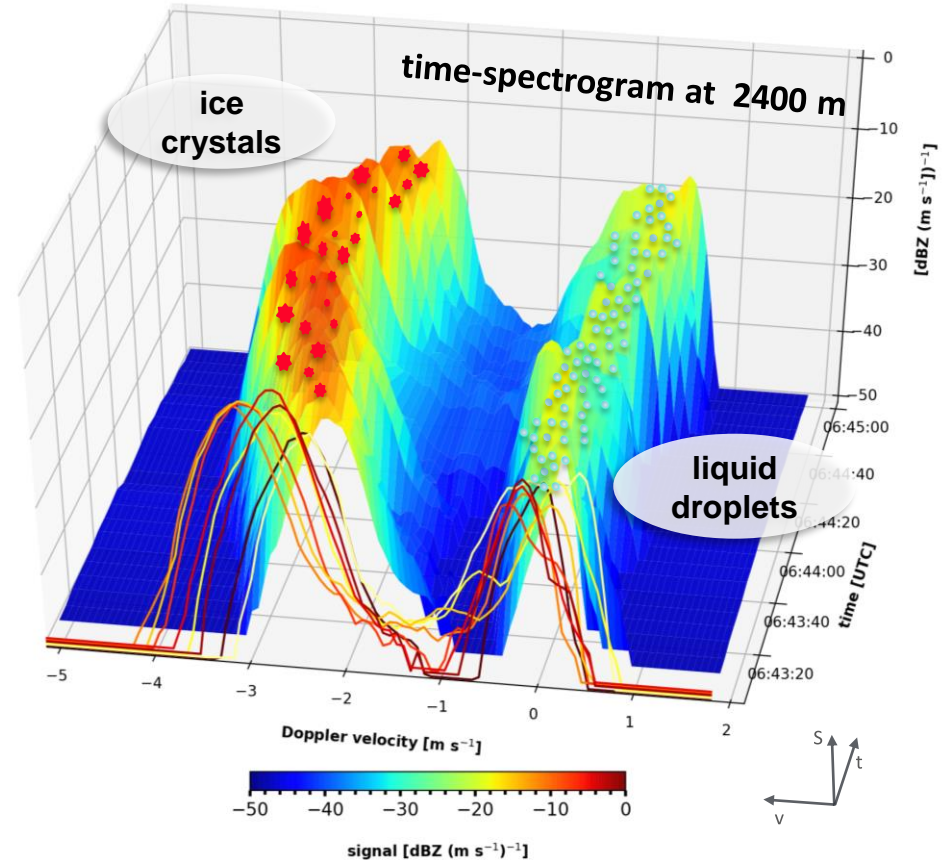
CD ... Cloud droplets

## New Machine Learning Approach

## Feature sampling

- use 6 consecutive (high res.) spectra, each range gate = 30 sec time-spectrograms
- noise/fill-values replaced by radar sensitivity limit
- 3D Doppler spectra  $S \rightarrow$  4D features  $X$ :
  - $\dim(S) = (n_{\text{time}}, 289, 256)$
  - $\dim(X) = (n_{\text{samples}}, 256, 6, 1)$
- normalization:  $\|X\|_{(-50,+20)[\text{dBZ}]} \Rightarrow \|X\| \in [0, 1]$
- encode corresponding Cloudnet label\*  $y$ :
  - $y(\text{"CD"}) = (1 \ 0)^T$  **or**  $y(\text{"no-CD"}) = (0 \ 1)^T$

➤ **no manual feature extraction nor labeling**



Punta Arenas, Chile: 1. August 2019 at 2.4 km

Cloudnet label\* ... only good radar and lidar echos

CD ... cloud droplets present  
no-CD ... no cloud droplets present

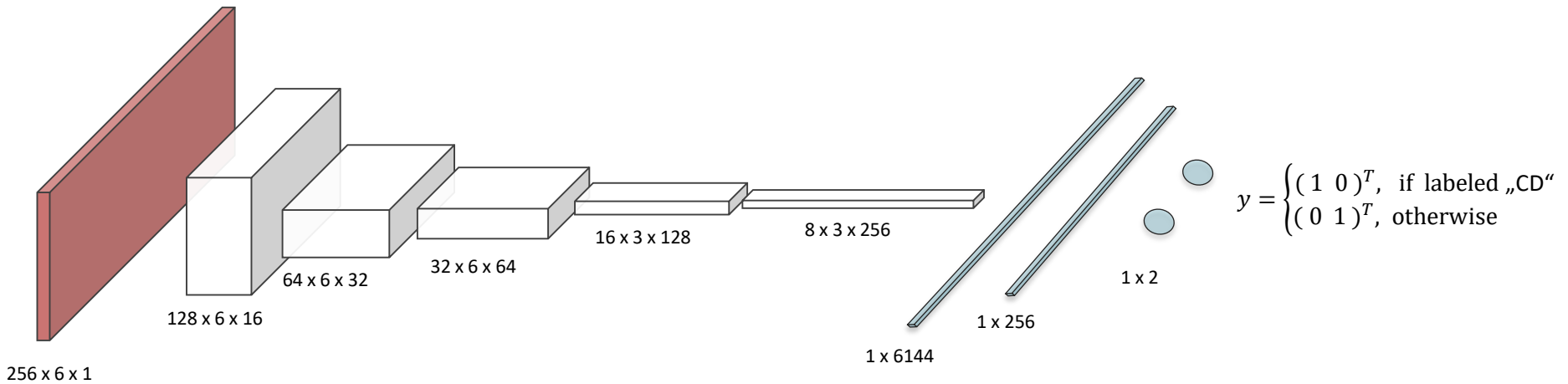
Machine Learning Model Architecture

Time-Spectrogram

Feature Extraction

Classification

Softmax



Input



Strided-Convolution Layer



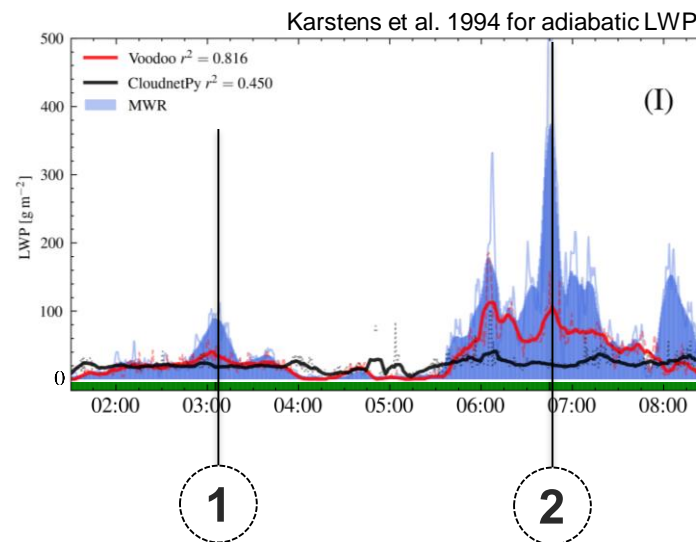
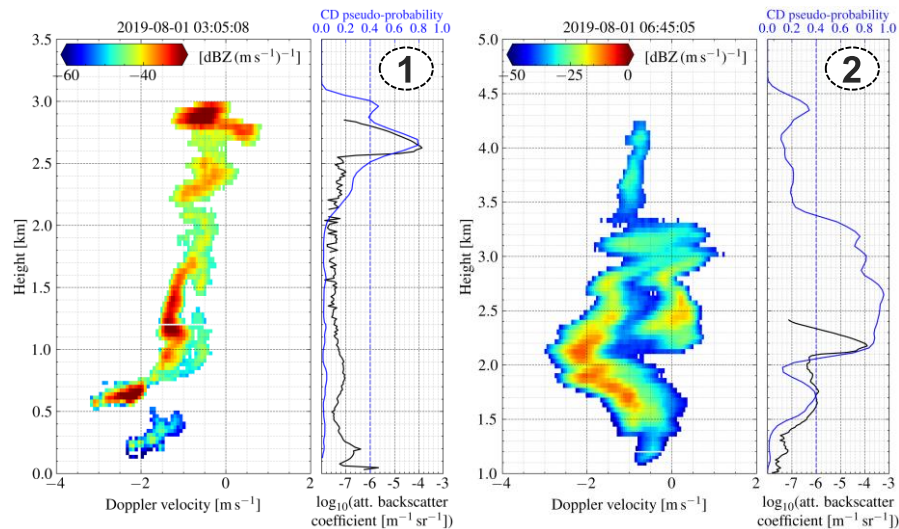
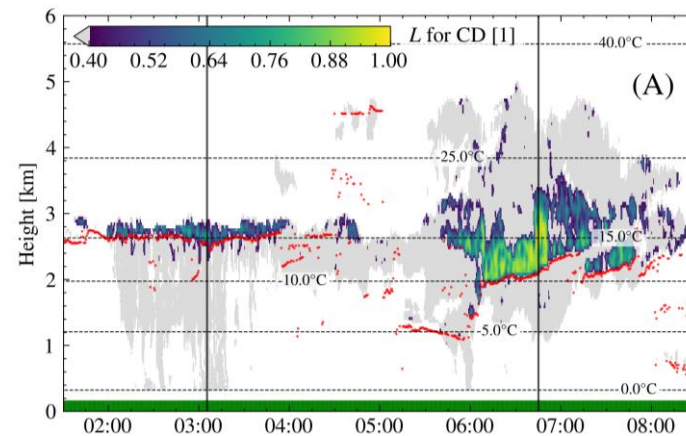
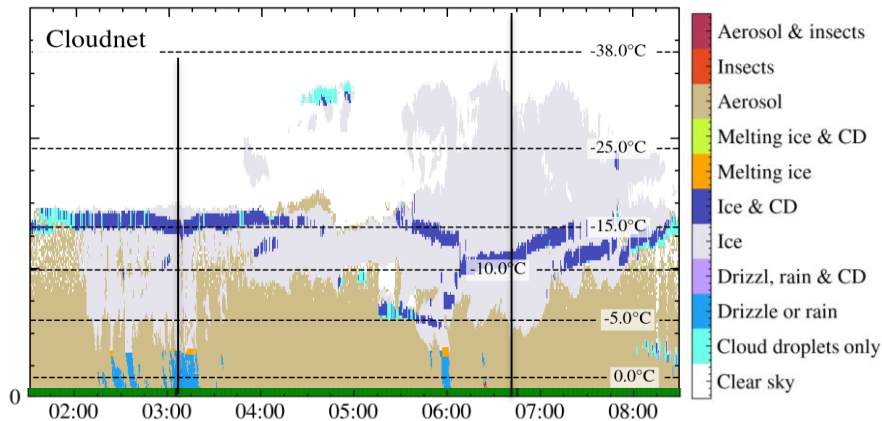
Fully-Connected Layer



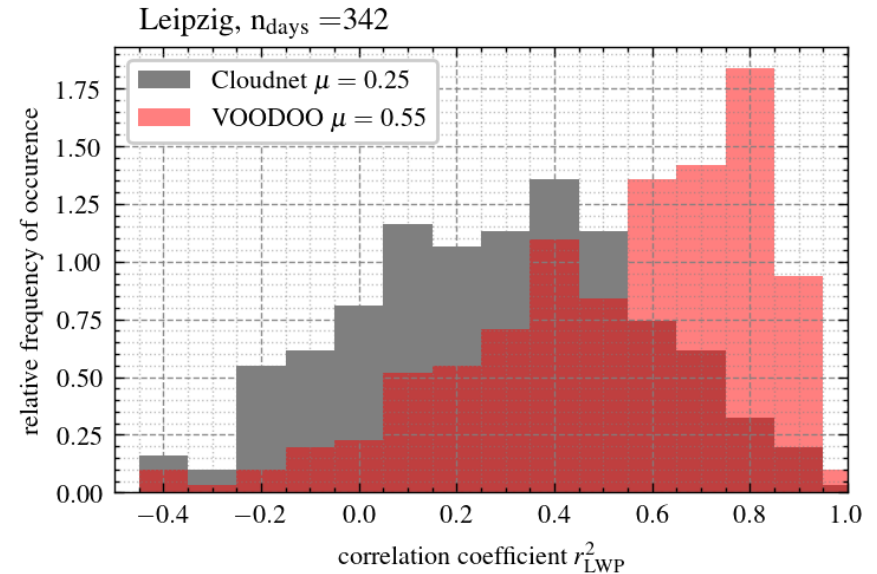
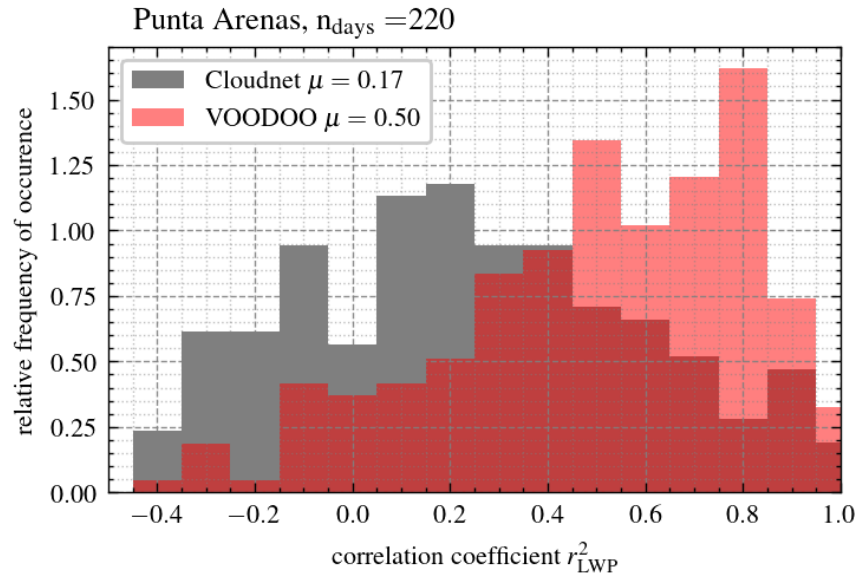
Output

CD ... cloud droplets present  
no-CD ... no cloud droplets present

Case study of 1. August 2019, Punta-Arenas, Chile

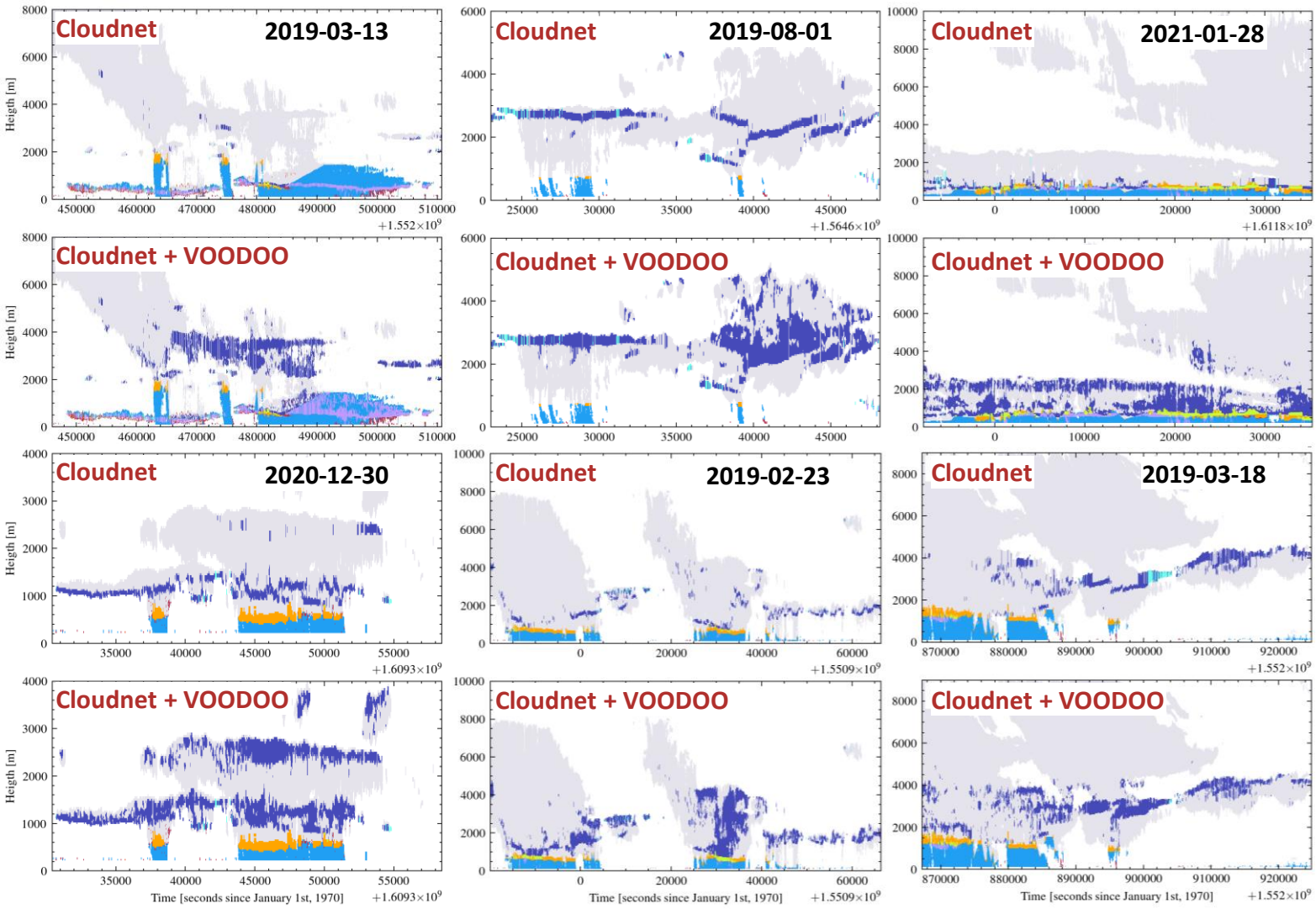


## Distribution as function of correlation coefficient of LWP

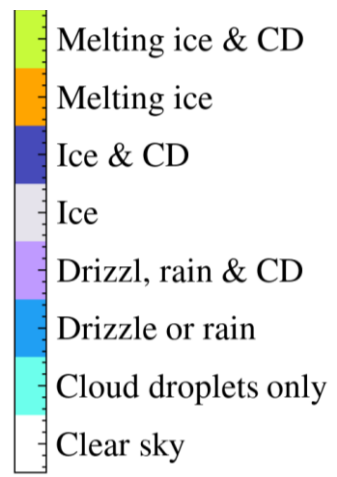

**Result:**

- frequency for higher correlation coefficient  $r_{\text{LWP}}^2$  increases for VOODOO predictions
- best performance for LWP > 100  $\text{g m}^{-2}$
- VOODOO able to accurately identify liquid layers beyond lidar attenuation





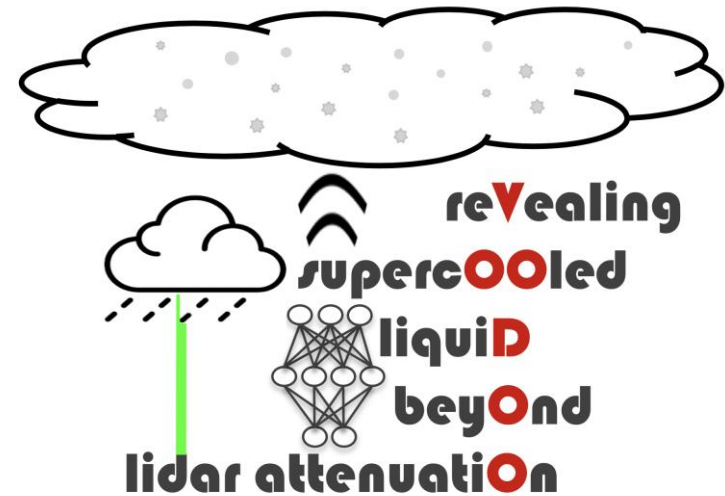
**OUTLOOK:**  
 VODDOO as  
 Cloudnet  
 feature



## Summary

### Remote-Sensing + Machine Learning

- Goal: Better estimation of ice/liquid distribution.
- VOODOO able to relate spectral morphologies to the availability of cloud droplets.
- Shows ability to extend the classification beyond full lidar attenuation.
- **Future usage:**
  - different geographical regions (Arctic data sets)
  - different Doppler radar (MIRA-35/KAZR/MWACR)
- **Outlook:** VOODOO as feature for Cloudnet



➤ [github.com/remsens-lim/Voodoo](https://github.com/remsens-lim/Voodoo)



# Retrieval of shape and orientation of multiple hydrometeor types from observations of scanning hybrid-mode Ka-band cloud radar

Majid Hajipour<sup>1</sup>

Cloud Remote Sensing Community workshop  
Tuesday 3rd and Thursday 5th May 2022

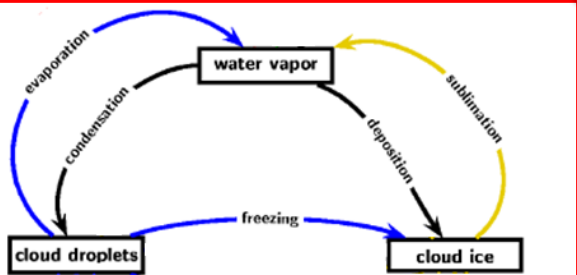
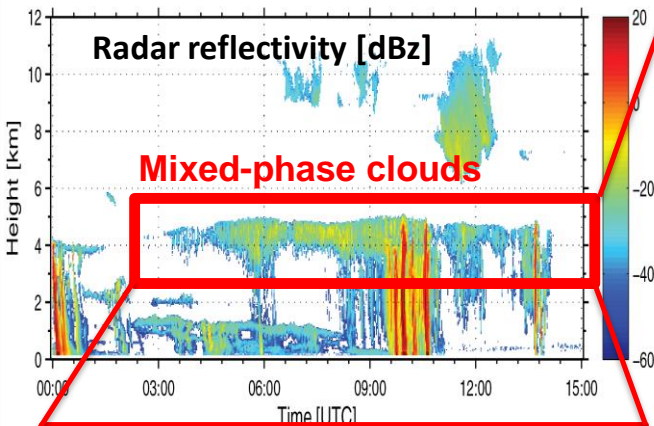
Co Author: Patric Seifert<sup>1</sup>

1: Leibniz Institute for Tropospheric Research (TROPOS), Leipzig, Germany



# Motivation: shape retrieval idea in mixed-phase clouds

Layered clouds, 30 Oct 2014, Cabauw, Netherlands



Thin mid-level cloud (mixed-phase)

Guichard et al. (2017)

### Growth processes

(a) Riming: Ice crystal + Super-cooled droplet → Rimed ice crystal

(b) Diffusional growth: Ice crystal + Water vapor → Larger ice crystal

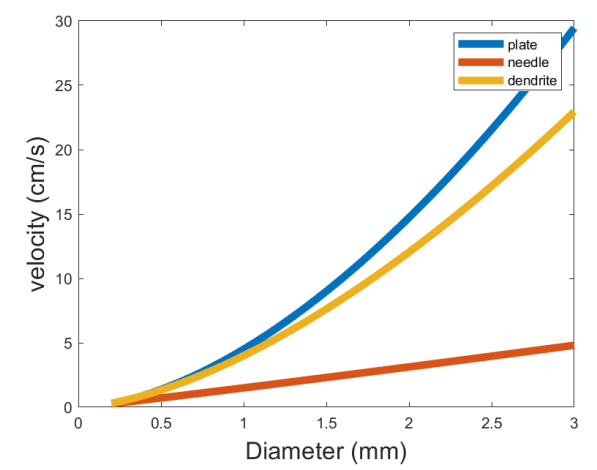
(c) Aggregation: Small ice crystals → Larger ice crystals

Small → Large

Related to Z

Majid Hajipour (hajipour@tropos.de), CCRES workshop


## Size-fall velocity relationships



Pfizenmaier et al. (2018)



# ACCEPT campaign



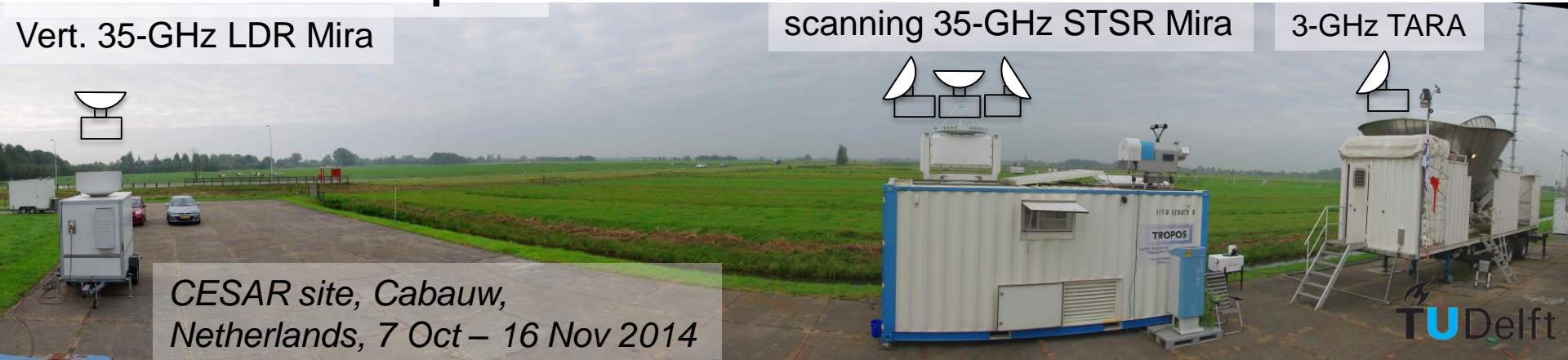
## ACCEPT Analysis of the Composition of Clouds with Extended Polarization Techniques

- 6-week measurement campaign at CESAR obs., Cabauw
  - **Vert. pointing LDR-mode Mira-35 (TROPOS)**
  - **Scanning STSR-mode Mira-35 (TROPOS/Metek)**
  - Tilted full polarimetric S-band TARA (TU Delft)
- + Lidars, MWR, Doppler lidar, wind profiler, radiosondes

Vert. 35-GHz LDR Mira

scanning 35-GHz STSR Mira

3-GHz TARA

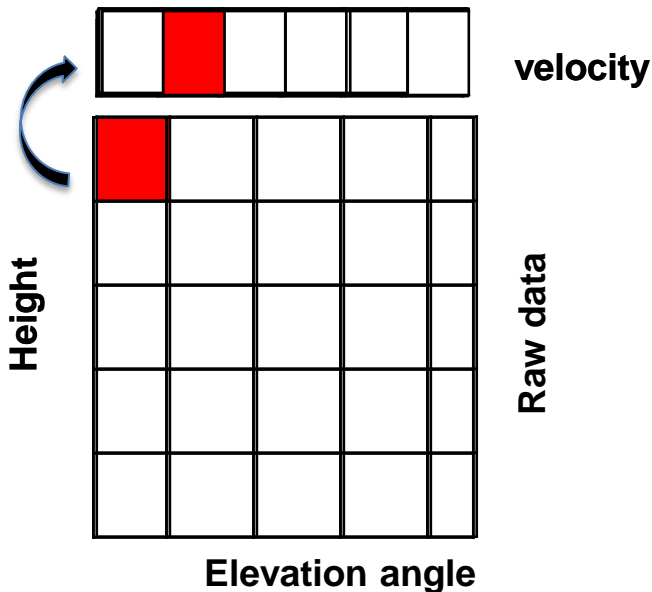
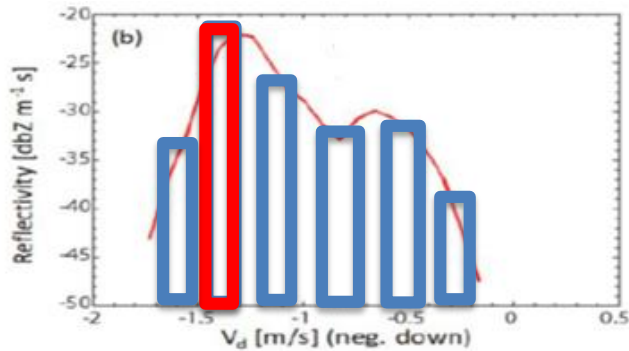


*CESAR site, Cabauw,  
Netherlands, 7 Oct – 16 Nov 2014*

Majid Hajipour (hajipour@tropos.de), CCRES workshop 41



# Original shape retrieval approach: Main peak of Doppler spectrum



## Modeling

Simulation of polarimetric variables ZDR and  $\rho_{hv}$  for different values of shape and orientation as a function of antenna elevation

## Observation

Selecting main peak of Doppler spectrum for each pair of height and elevation angle

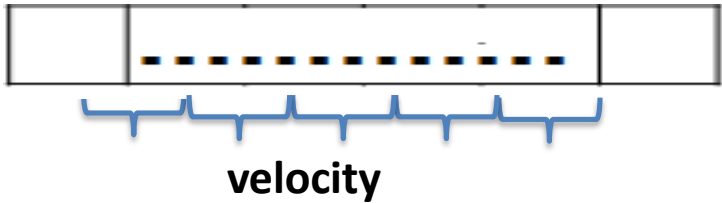
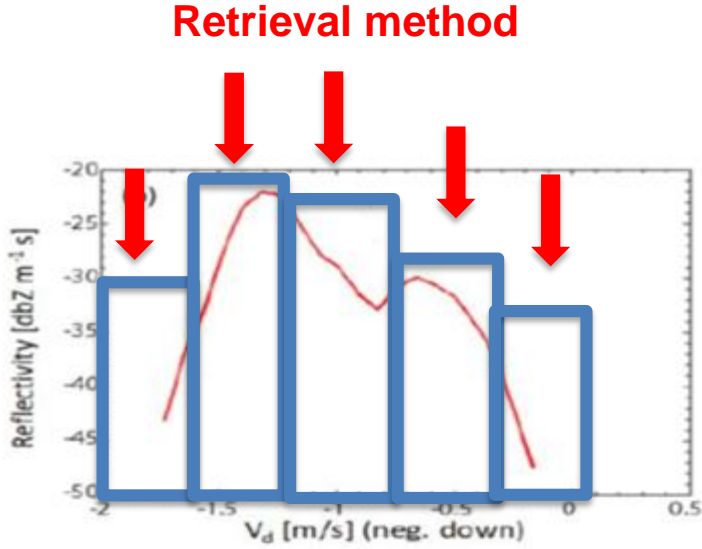
Comparing observed and modeled ZDR and  $\rho_{hv}$  to find best agreement. (using minimum mean square error)

Shape & orientation

Majid Hajipour (hajipour@tropos.de), CCRES workshop

**TROPOS**

# Extension of Myagkov et al. 2016 (AMT) shape retrieval approach



## Modeling

Simulation of polarimetric variables ZDR and  $\rho_{hv}$  for different values of shape and orientation as a function of antenna elevation

## Observation

Splitting Doppler spectrum into 5 bins for each pair of height and elevation angle

Comparing observed and modeled ZDR and  $\rho_{hv}$  to find best agreement. (using minimum mean square error)

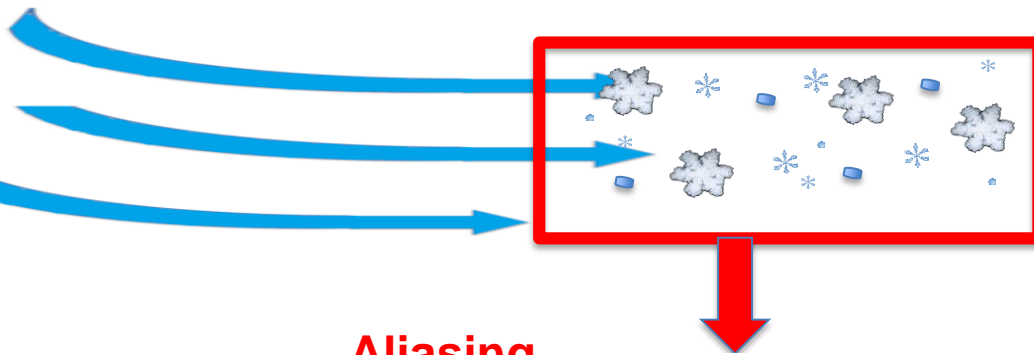
Shape & orientation





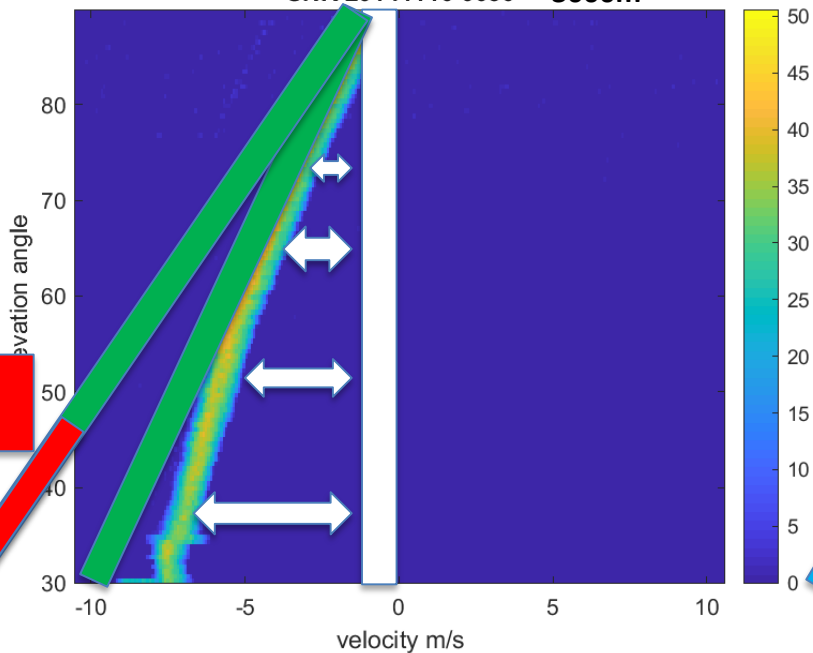
## Wind effects

- ✓ horizontal wind effects shift the Doppler spectrum. This shift increases with decreasing elevation angle.



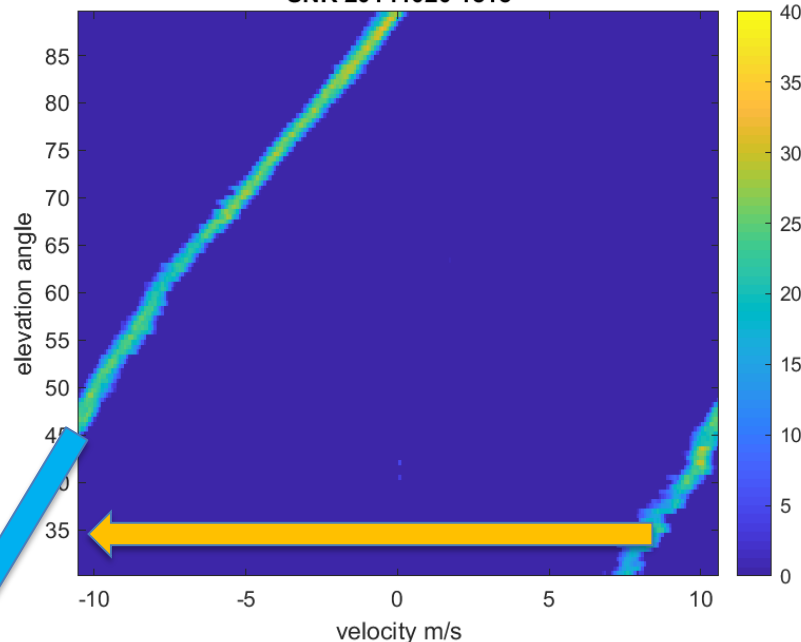
### Doppler shift

SNR 20141110 0030 3000m



### Aliasing

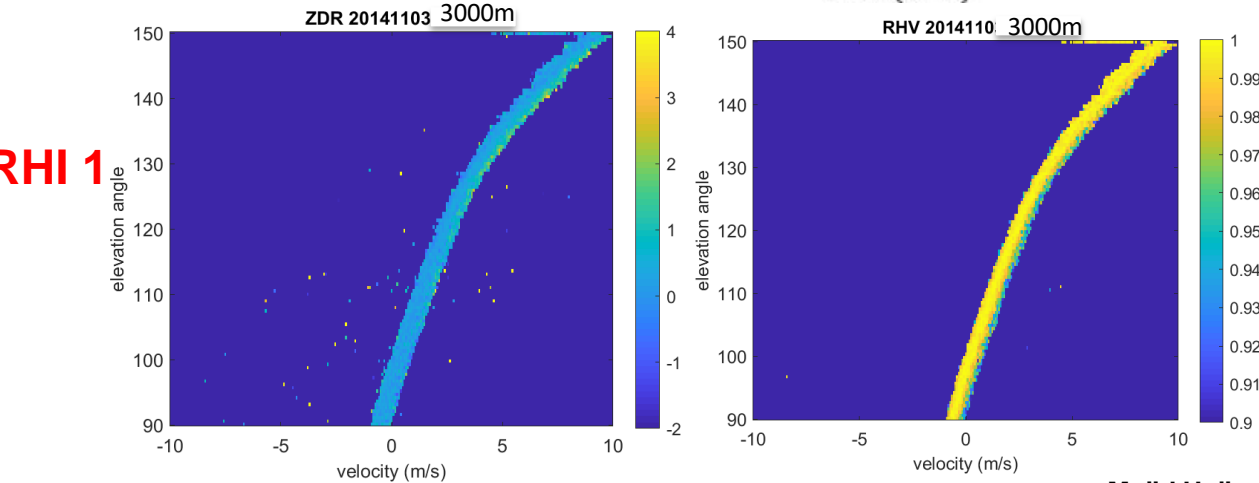
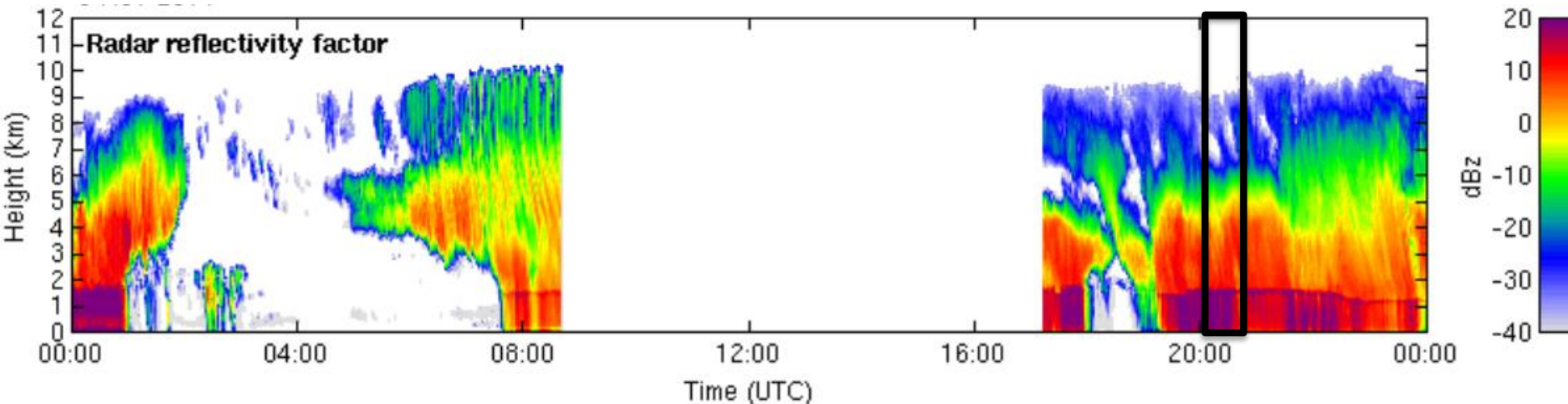
SNR 20141020 1815



Majid Hajipour (hajipour@tropos.de), CCRES workshop

**TROPOS**

**Result:** Case study: Date: 2014.11.03 Time: 20:00-20:15 Height: 3000 m

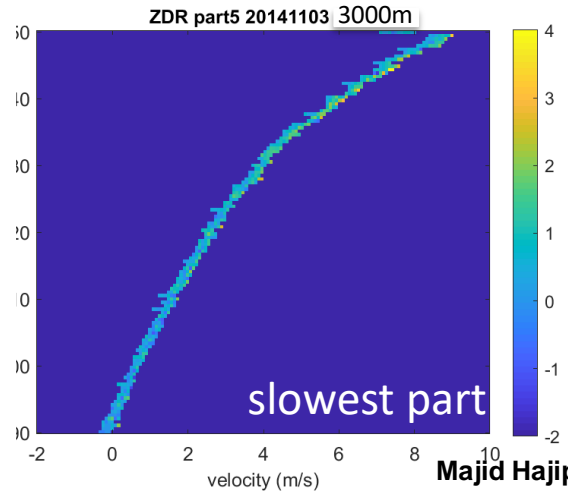
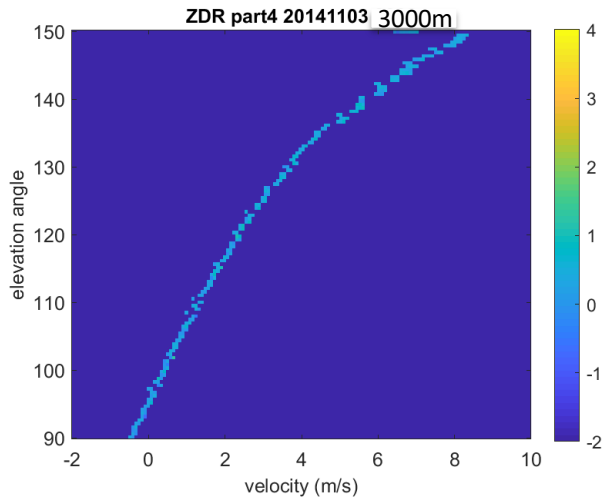
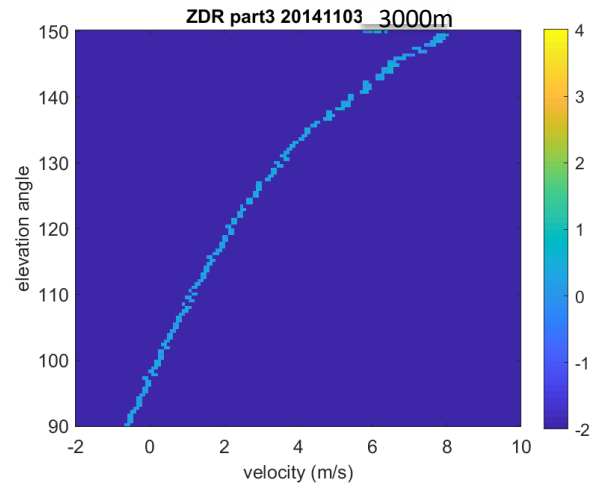
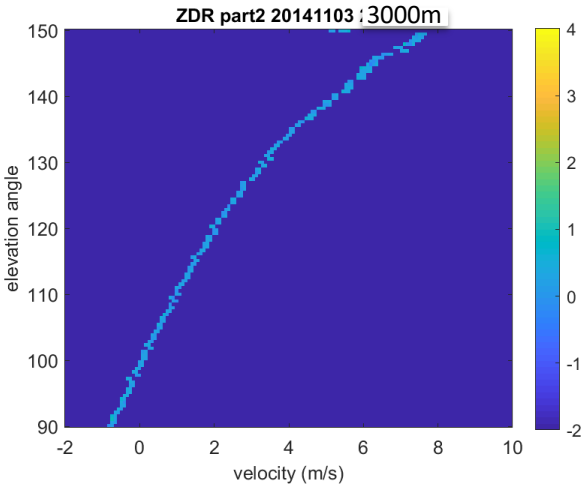
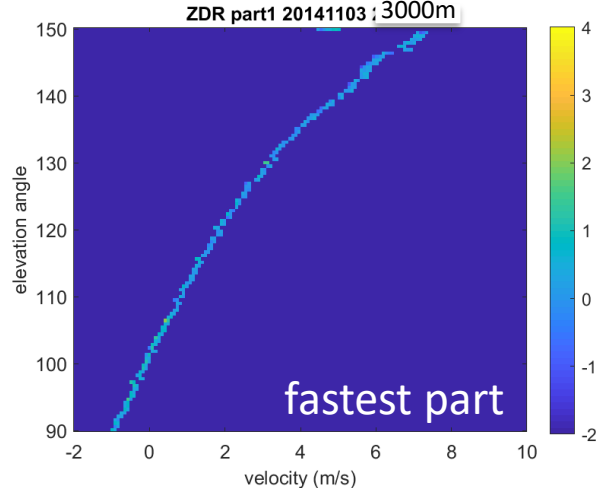


Split of RHI-scans of Doppler spectra of ZDR and RHV into 5 parts

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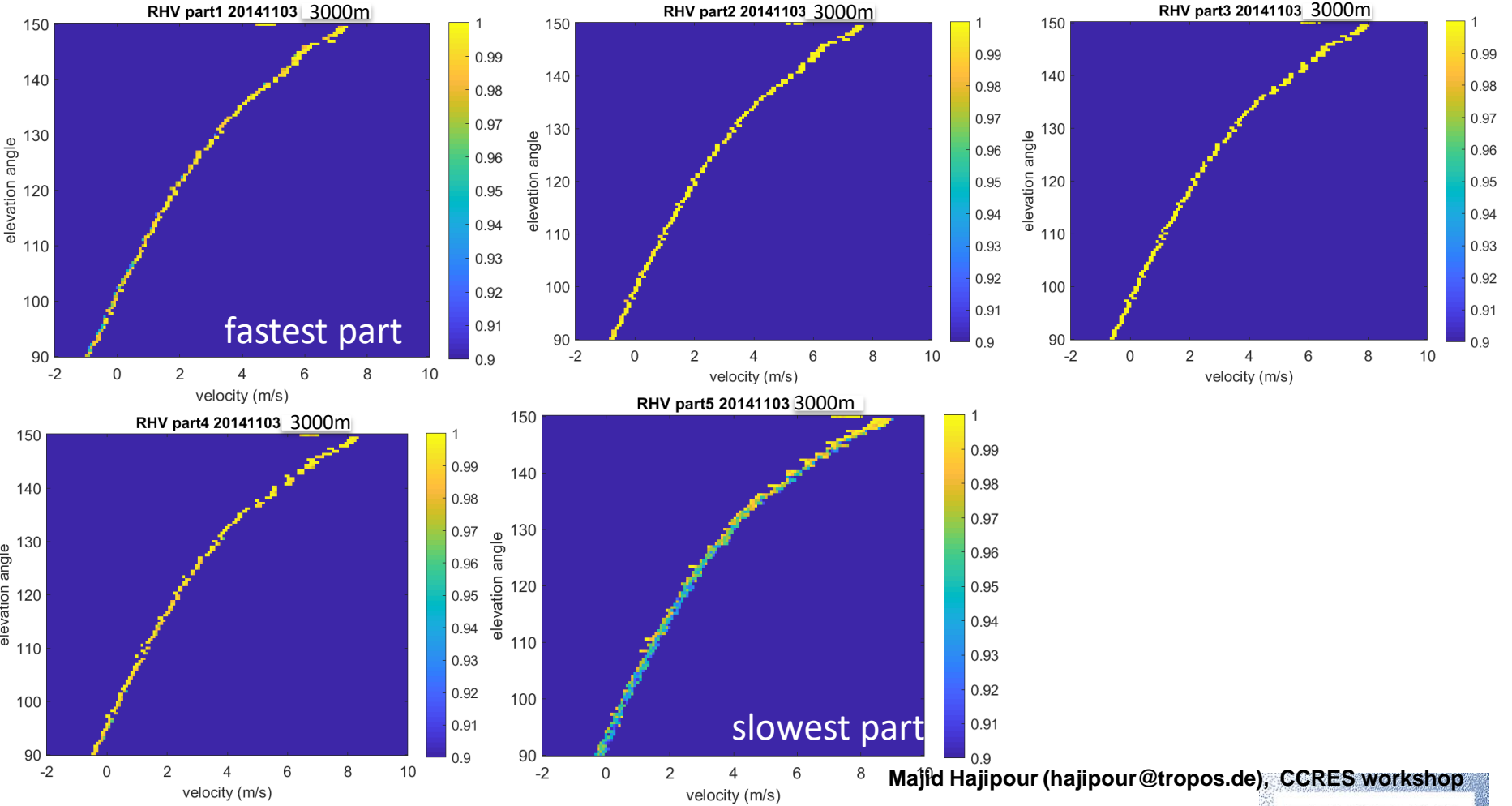
# Differential Reflectivity (ZDR) for each Doppler part



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# Correlation Coefficient (RHO\_HV) for each Doppler part



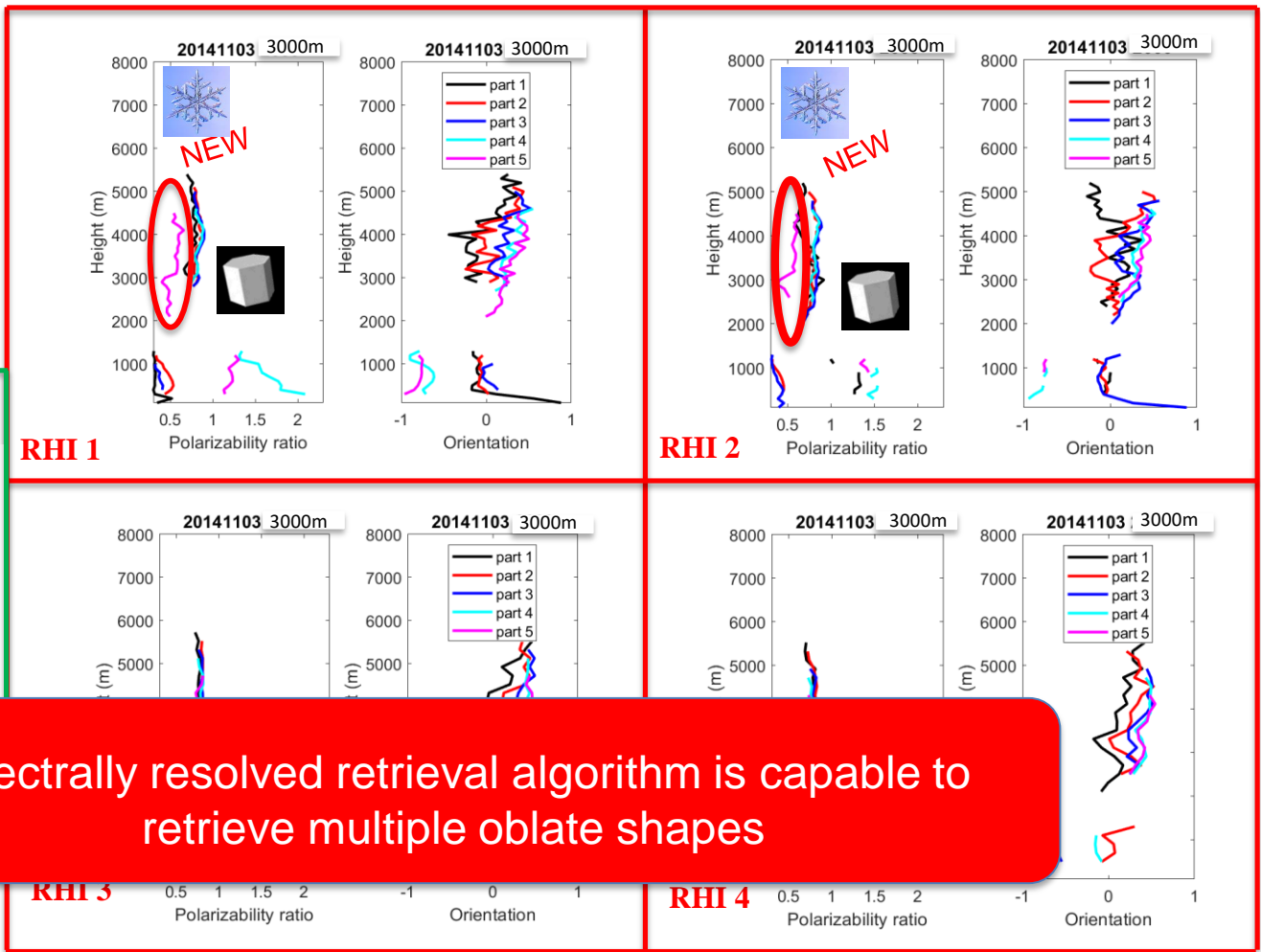
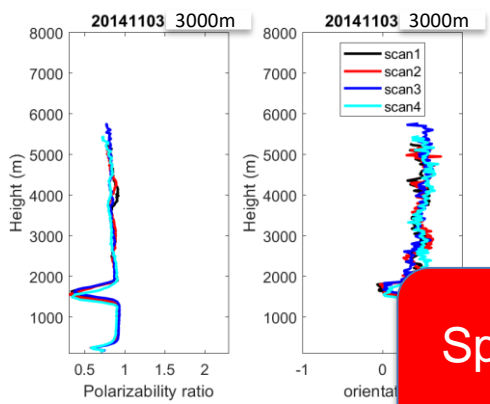
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# Retrieval results

Date: 2014.11.03  
Time: 20:00-20:15  
Height: 3000 m

## Main Peak



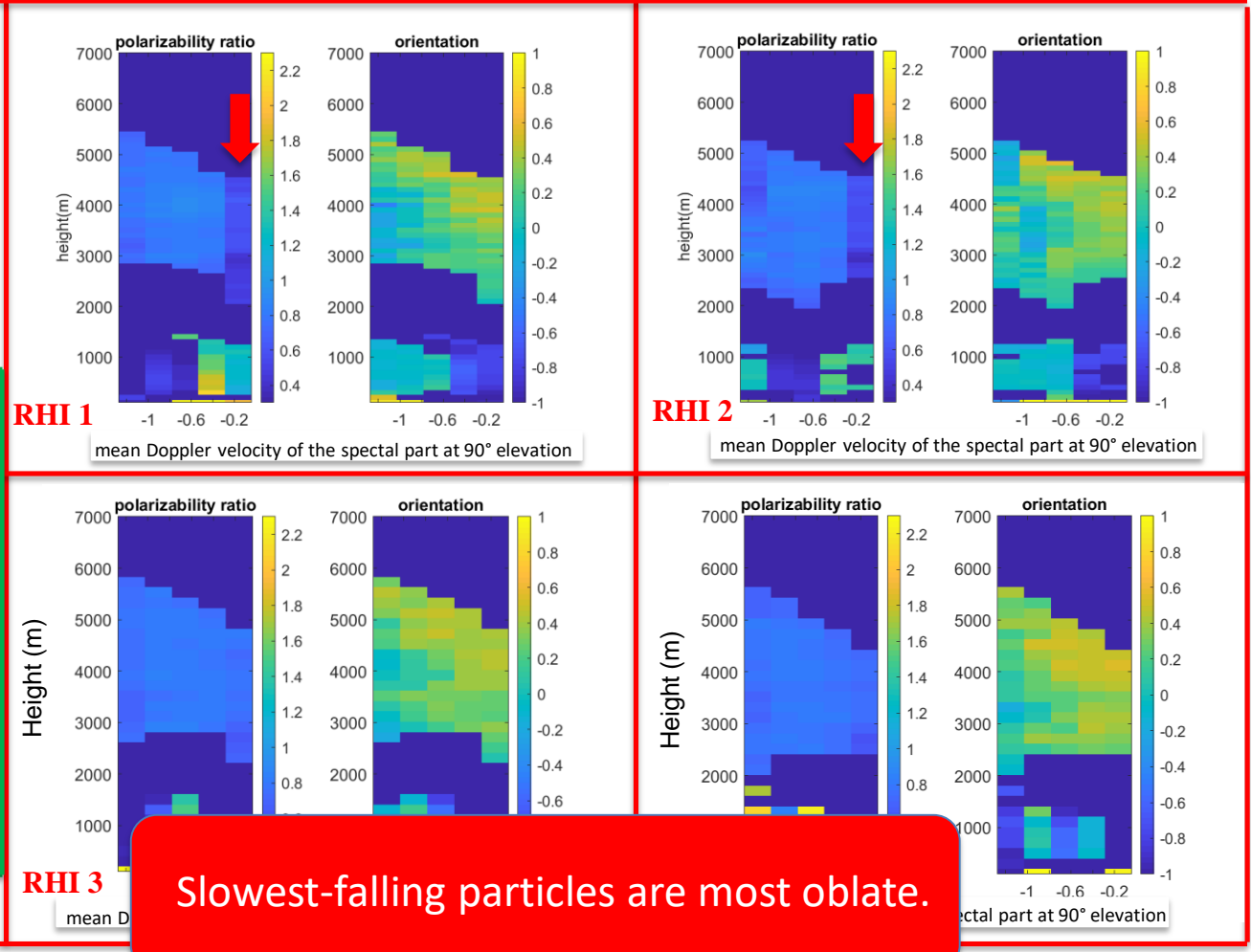
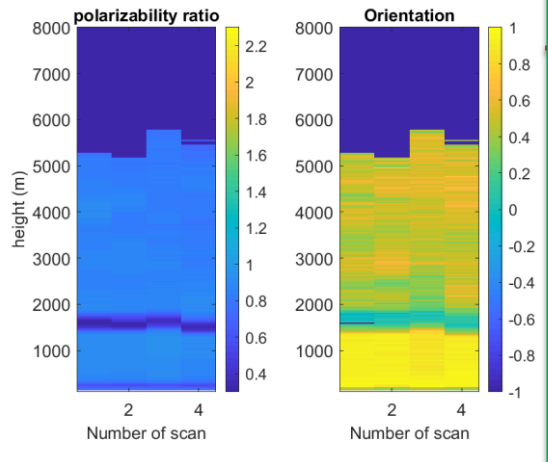
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# Retrieval results

Date: 2014.11.03  
 Time: 20:00-20:15  
 Height: 3000 m

## Main Peak for 4 RHI scans



**Slowest-falling particles are most oblate.**

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## Summary

- ❖ Scanning polarimetric cloud radar enables us to retrieve shape and orientation of ice particles.
- ❖ Using spectrally resolved approach, multiple hydrometeor types can be retrieved.
- ❖ Automatic retrieval exists
- ❖ Based on one 5-minute RHI scan of ZDR and RHV, information about shape distribution can be obtained regularly
- ❖ Quantitative approach which can be applied to STSR(hybrid-mode) polarimetric (cloud) radars.

**Thanks for your  
attention!**

Majid Hajipour (hajipour@tropos.de), CCRES workshop

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