

# Cloud detection and quality checks for stand alone ground based microwave radiometer

Moritz Löffler

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 → LV1: Brightness temperatures (T<sub>b</sub>)
 → LV2: Temperature and water vapor profile Liquid water path (LWP)





#### **Microwave Radiometers in Weather Prediction**







#### **Data for Assimilation**



All steps performed in the observation space i.e. Brightness Temperatures (Tb) rather than retrieved thermodynamic profiles.





## **O**WD

#### Assimilation of MWR Tb





#### MWR Observations minus Background (OmB)





## MWR OmB including cloudy data Obs. minus first guess HatproG5 LG - ICON-D2

(with static bias corr)



The displayed data include a bias correction to account for the systematic deviations

- Significant differences in presence of liquid water are visible
- $\triangleright$ Transient deviations (clear-sky) indicate the information content with respect to the model background



#### Impact of Cloud Liquid Water and Rain



Histogramme von Beobachtung (MWR @ Lindenberg) minus Background (ICON-D2) from Okt. '20 to Dez. '21 sortiert nach detektiertem Einfluss von Flüssigwasserwolken in Beobachtung bzw. Model . Nur TB<sub>MW</sub> @ 22.2GHz.

- > In presence of clouds, the distributions are skew, asymmetrical und broad.
- > In presence of rain or dew: very large mean deviations due to signals of non atmospheric origin





#### Impact of Cloud Liquid Water (and Rain)



- K-Band and transparent part of V-Band are sensitive to cloud liquid water
- Small scale variability of liquid water causes a error of representativity in model comparisons
- Variability of Tb and Liquid water path are known indicators for detecting cloud liquid water.







#### Cloudy/Clear-sky Classification







#### **Detect Liquid Water Clouds**

# Image: second clear 0.8 0.2 - 1.00 Image: second clear 0.8 0.2 - 0.75 Image: second clear 0.14 0.86 - 0.25 Image: second clear - 0.00 - 0.00 Image: second clear - 0.00

Performance of the empirical method

Rate of detection of liquid water clouds using the CloudNet target classification as a ground truth reference.

#### New Development

- Develop a machine learning based algorithm with
  - low latency,
  - geographic independence,
  - few requirements to additional instrumentation
  - applies to all elevation angles
- Aiming to obtain a standard algorithm which is accepted and used within ACTRIS and E-profile.
- Develop a method which assesses the spectrum consistency and can also be used for quality checks.





### First look into data and filtering

#### Observed data with cloud info



- Using CloudNet target classification as a ground truth for evaluating classification algorithms.
- clear-sky, cloudy and overlapping
- Removing cases with rain (rainsensor)
- Removing cases with rain (distrometer)
- Add undetected low clouds to CloudNet classification
- Final dataset which I'll be using in the following



#### **Precision and Recall**





#### **Empirical Method**



- Performance of empirical method is benchmark for new developments
- Overlapping structure of dataset complicates separation of clear and cloudy cases.
- The presence of liquid clouds at very low TbIR indicates issues with CloudNet classification as a "True" reference





#### Neural Network with 1 hidden layer (Perceptron)



- Performance is typical for ML based algorithms.
- ML based approaches result in small improvements with respect to the empirical method.
- Including additional dimensions for predicting has a small impact on precision and recall







#### Descision tree -> random forest (tree ensemble)









#### **Random Forest**





#### Spectral consistency







#### Liquid water on the radome



FESSTVaL campaign summer 2021 @Lindenberg

The radome is kept dry with:

- heater, blower and rain sensor
- Hygroscopic coating

Automatic identification of water on the radome (e.g. after rain events):

Evaluation of spectral consistency of Tb data: Tb observations vs. Tb spectral retrieval from neural network retrieval algorithm (LV2 product)







#### Liquid water on the radome Observation HATPRO G5 minus SPC retrieval (RPG) @ 53.9 GHz Brightness Temperature in K 12 threshold TB obs minus retrieval 10 rain 8 wet 6 Δ 18:15 18:05 18:10 18.20 18:25 18:30 18:00 Time 2021-May-15 Observation HATPRO G5 minus SPC retrieval (RPG) @ 53.9 GHz Brightness Temperature in K 12 threshold TB obs minus retrieval 10 rain 8 wet 6 4 2 19:25 19:30 19:35 19:55 19:15 19:20 19:40 19:50 20:00 19:45 2021-Aug-10 Time







#### Outlook



- Cloudy/clear-sky classification and spectral consistency checks based on
  - Reanalysis and radiative transfer modelling,
  - Observed data
- which
  - has few requirements to additional instrumentation
  - applies to all elevation angles
  - is simple and fast





#### Thank you!

Kontakt:

Moritz Löffler

Moritz.loeffler@dwd.de



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BMD Seminar 1 Moritz Löffler