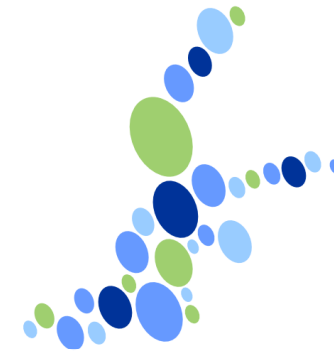


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# BALTRAD dual polarization hydrometeor classifier

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FMI: Jarmo Koistinen, Markus Peura

SMHI: Daniel Michelson

ARPA: Roberto Cremonini

# What is BALTRAD ?

- Advanced weather radar network for the Baltic Sea Region
- Financed by European Union in the framework of the Baltic Sea Region programme 2007 – 2013
- BALTRAD project: 2009 – 2011
- BALTRAD+ project: 2012 - 2013
- Real time weather radar data exchange in a decentralized network.
- Visit: <http://www.baltrad.eu/>

*One of the activities: Dual Pol. classifier*

## Its components:

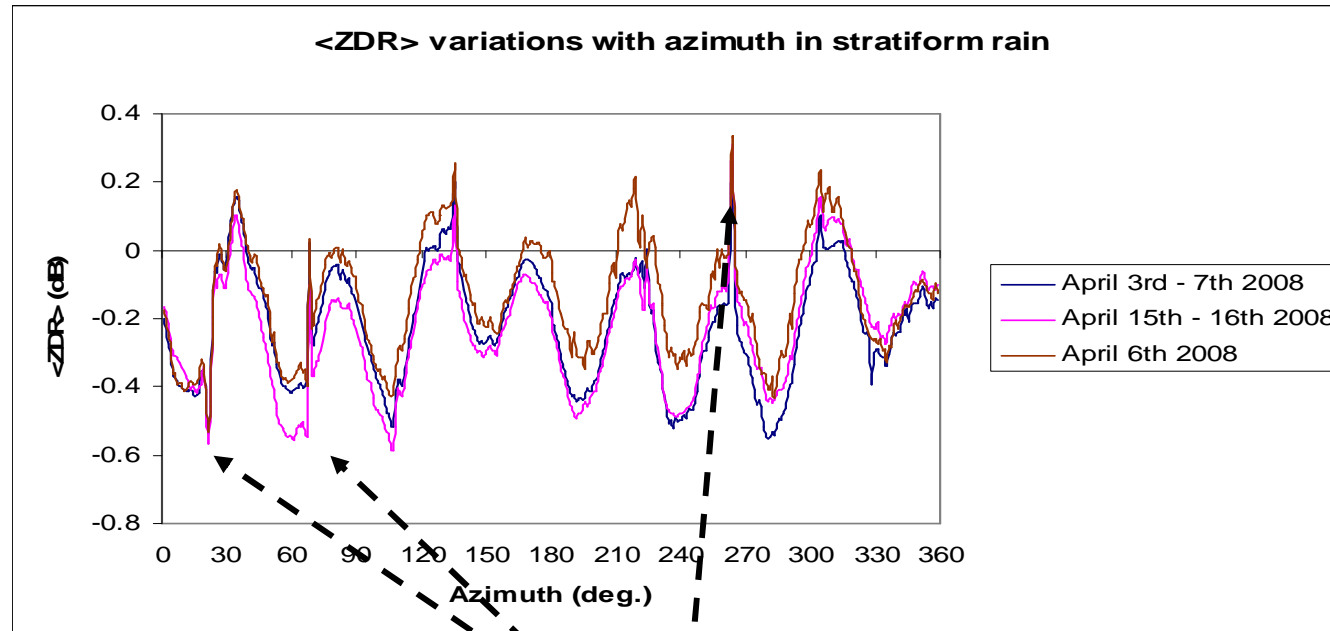
1. Ensure good quality and “stable” data: special thanks to Beatrice Fradon, Meteo-France
  - *Mitigate radome effects on Zdr,  $\Phi dp$*
  - *Zdr offset correction (currently using Zdr scans at  $90^\circ$  + sun calibration)*
  - *Monitor  $\phi dp0$  offset*
  - *Monitor the quality of Zdr in light rain (20 dBZ – 22 dBZ) at close range*
  - *Monitor phv in rain (upper 75% quantile)*
2. Computation of  $K_{DP}$
3. Correcting ZHH and ZDR for rain attenuation
4. Computation of the Melting layer (radar and NWP)
5. Fuzzy logics classification scheme:
  - *Computation of the membership functions for each pre-specified radar echo class*
  - *Using fuzzy rules compute the “scores” by each parameter (expert) for each pixel*
  - *Weight the “scores” from each parameter*
  - *Compute the total score for each class from all the parameters*
  - *Final class is the one with e.g., the highest score*



DMI weather radar network:  
2 dualpol radars at Bornholm and Virring

# Sensitivity of Zdr to radar RADOME

(DMI radomes: orange peel)



Bornholm radome with 8 panels

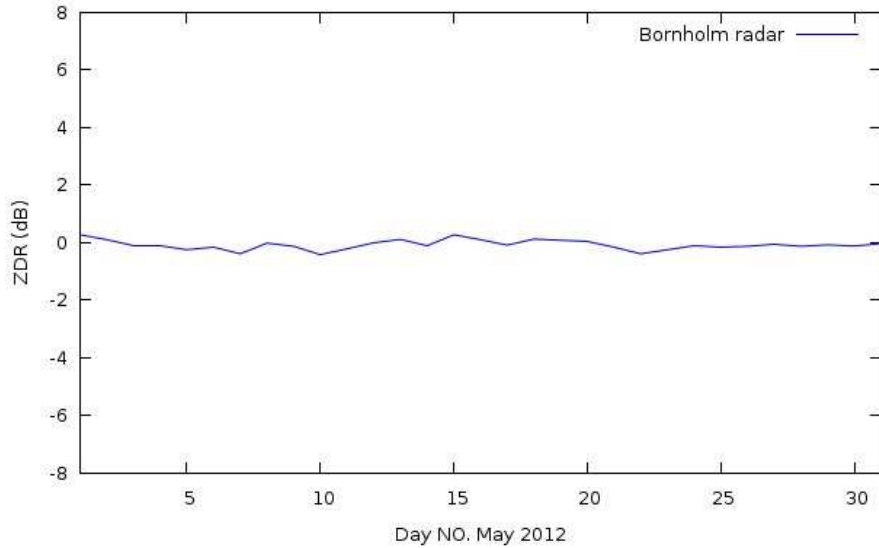
Blocking from other radars at the site

All elevations used:  $0.5^\circ$ ,  $0.7^\circ$ ,  $1.0^\circ$ ,  $1.5^\circ$ ,  $2.4^\circ$ ,  $4.5^\circ$ ,  $8.5^\circ$ ,  $10^\circ$ ,  $13.0^\circ$ ,  $15.0^\circ$   
SNR > 25 dB, ht < 1200 m, range > 5 km, phv > 0.97

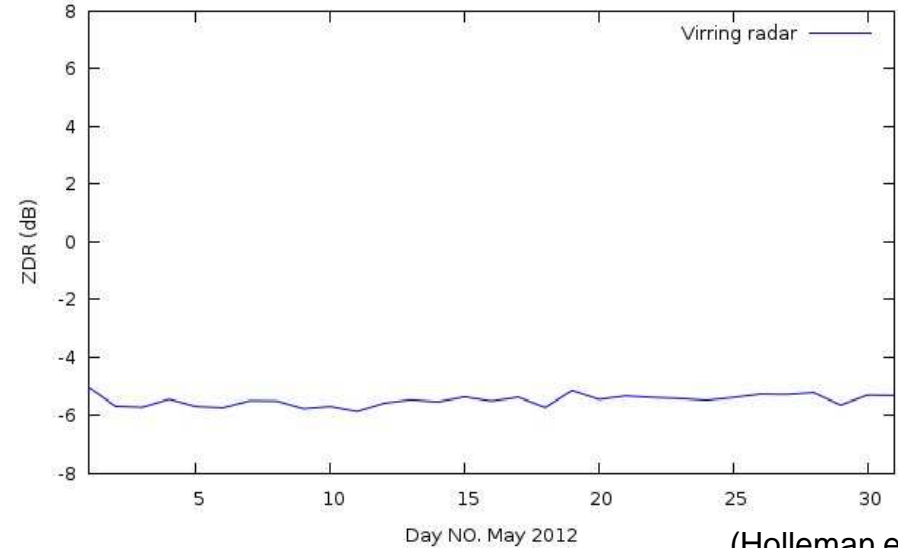
# ZDR biases from daily SUN HITS



ZDR biases computed from the daily SUN HITS



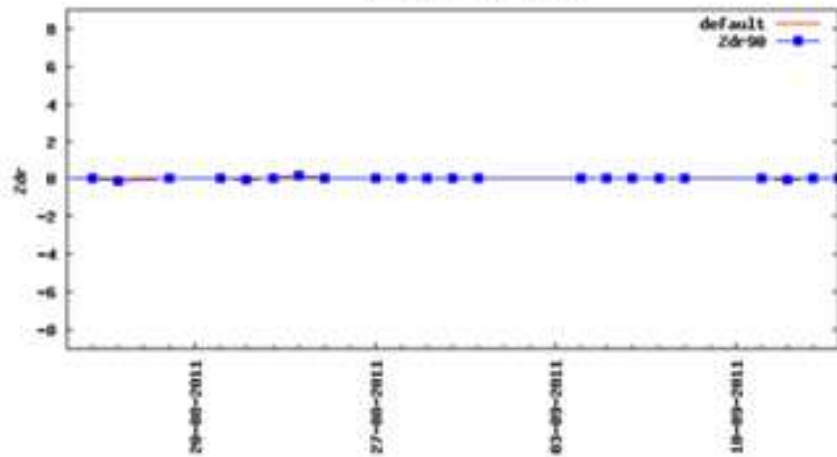
ZDR biases computed from the daily SUN HITS



(Holleman et. al., 2010)

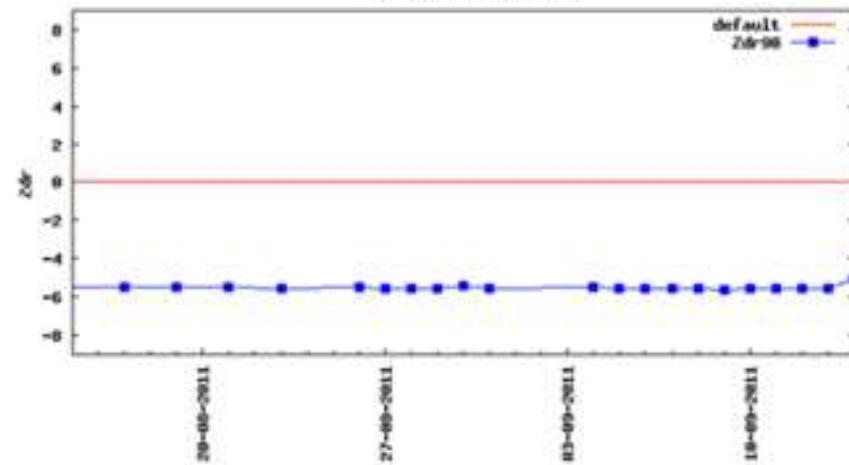
Diurnal potential biases in the ZDR parameter for the Bornholm and Virring radars, computed using the radar scan at 90° elevation.

Radar Calibration Monitoring - Zdr monitored by a vertical scan  
Bornholm (last 30 days)



Bornholm radar

Radar Calibration Monitoring - Zdr monitored by a vertical scan  
Virring (last 30 days)



Virring radar

# Computation of specific differential phase $K_{DP}$

- $K_{DP}$  parameter is not available from the radar processing software provided by the radar manufacturer.
- $K_{DP}$  is computed as follows (Boumahmoud et. al, 2010):
  - The differential phase shift offset,  $\Phi_{DP}(0)$ , is computed dynamically for each ray from the first 5 gates containing precipitation (gate size = 0.5 km)
  - $\Phi_{DP}(0)$  is then smoothed using a median filter with a window size of 6.5km,
  - $K_{DP}$  is then estimated by fitting a straight line on the above window.

Many algorithms e.g., the simplest : path integrated attenuation (PIA):

The parameters ZHH and ZDR are corrected for attenuation due to rain using the following relations:

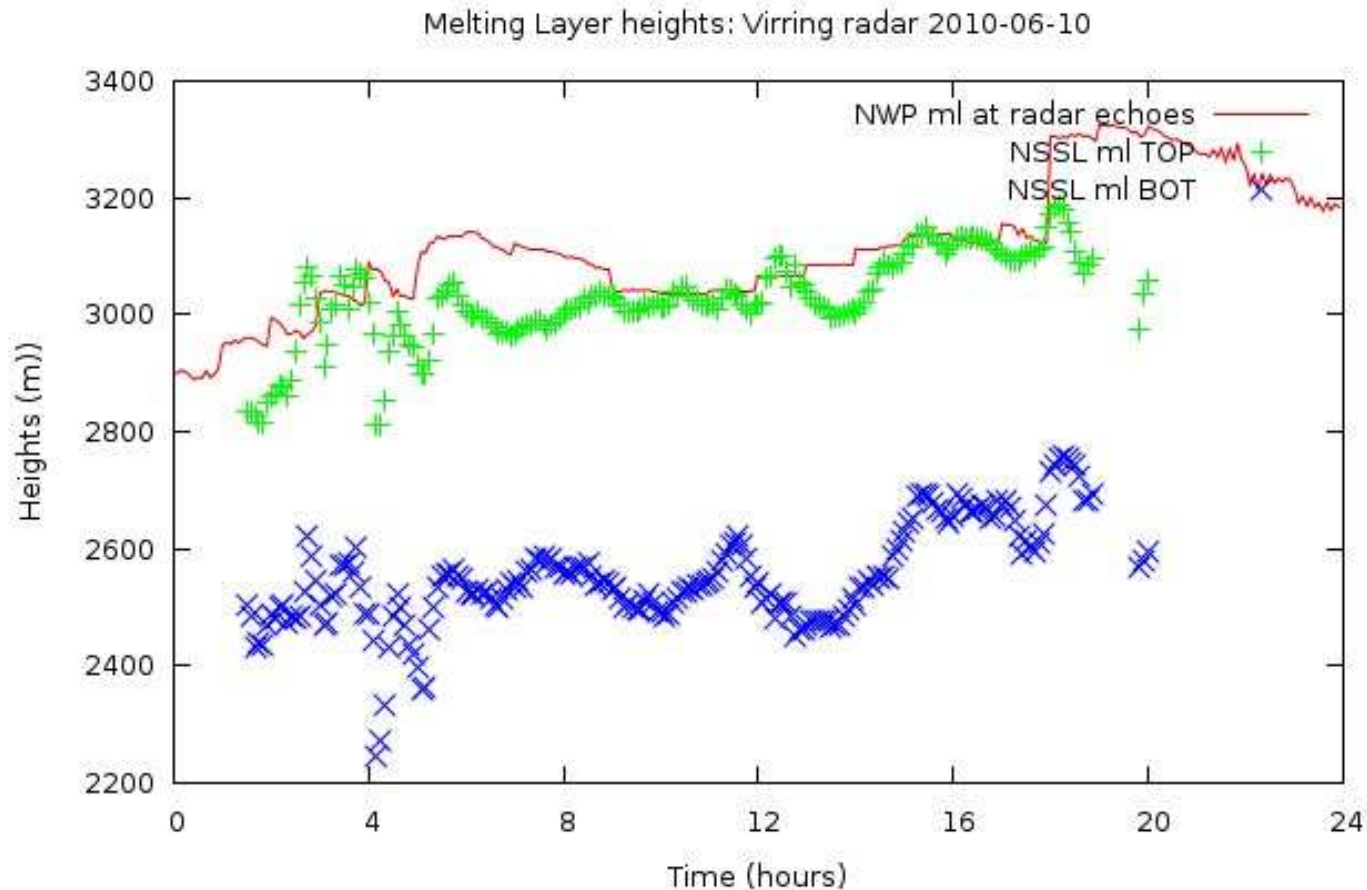
$$ZHH \text{ (new) } (r) = ZHH \text{ (old) } + \alpha \cdot [\Phi_{DP}(r) - \Phi_{DP}(0)]$$

$$ZDR \text{ (new) } (r) = ZDR \text{ (old) } + \beta \cdot [\Phi_{DP}(r) - \Phi_{DP}(0)]$$

where the  $\alpha$  and  $\beta$  are constants and at C-band have the values 0.08 dB/deg. and 0.03 dB/deg. , respectively (Gourley et al., 2007a).



# Daily computation of the Melting layer using NSSL algorithm



NWP melting layer: Resolution: 5 km X 5 km  
down sampled to 2km X 2km pixels.

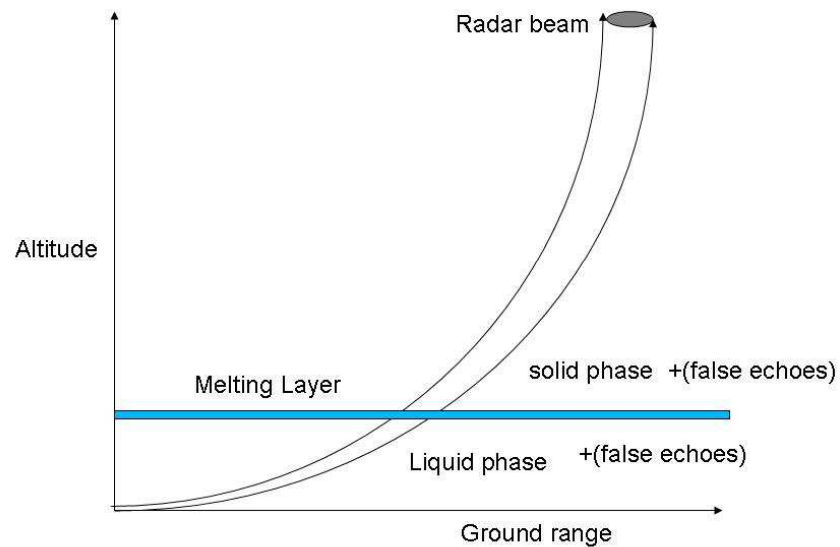
Forecasts made every hour.

Future use 3 km X 3 km resolution forecasts

- Performs well when volumes are full, and also when the melting layer above ~1 km
- Low elevation scans not used – cannot determine ML heights for approaching fronts at far range

# Hydrometeor Classifier ( using fuzzy logics)

*Classify what the radar rays experience not what is observed on the ground*



## Pixel based fuzzy logics made simple:

*Pixel of hydrometeor class j has a score S<sub>j</sub> given by the relation*

$$S_j = \frac{\sum_i w_i \cdot P_i}{\sum_i w_i}$$

where P<sub>i</sub> and W<sub>i</sub> are the value of the parameter i, and the associated weight, for the class j

*The class that gets the highest score wins.*

- Parameters used:
  - Z<sub>hh</sub>, Z<sub>dr</sub>, ρ<sub>hv</sub>, K<sub>dp</sub>, (+ texture parameters of Z<sub>hh</sub>, Z<sub>dr</sub>, Φ<sub>dp</sub>),
  - HT NWP melting layer (only needed in level -2 classification – see later)

Main challenge lies in having representative membership functions

- Need to compute the membership functions for ALL the different types of echoes observed by the radar. If a particular class is not accounted for then it will be misclassified into one of the pre-determined classes.

# Current hydrometeor classes

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Current version has 11 hydrometeor classes (*blue: internally in the system*):

- Ground clutter (2)
- Sea clutter (2)
- Electrical signals from external emitters that interfere with our radars + sun hits (10)
- Clean air echoes (CAE) such as from birds, insects (3)
- Light rain (4: *light drizzle, moderate drizzle, heavy drizzle, light rain*)
- Moderate rain
- Heavy rain
- Violent rain
- light snow
- Moderate to heavy snow
- Hail/rain mixture

Subsequent versions of the algorithm will also include the following classes:

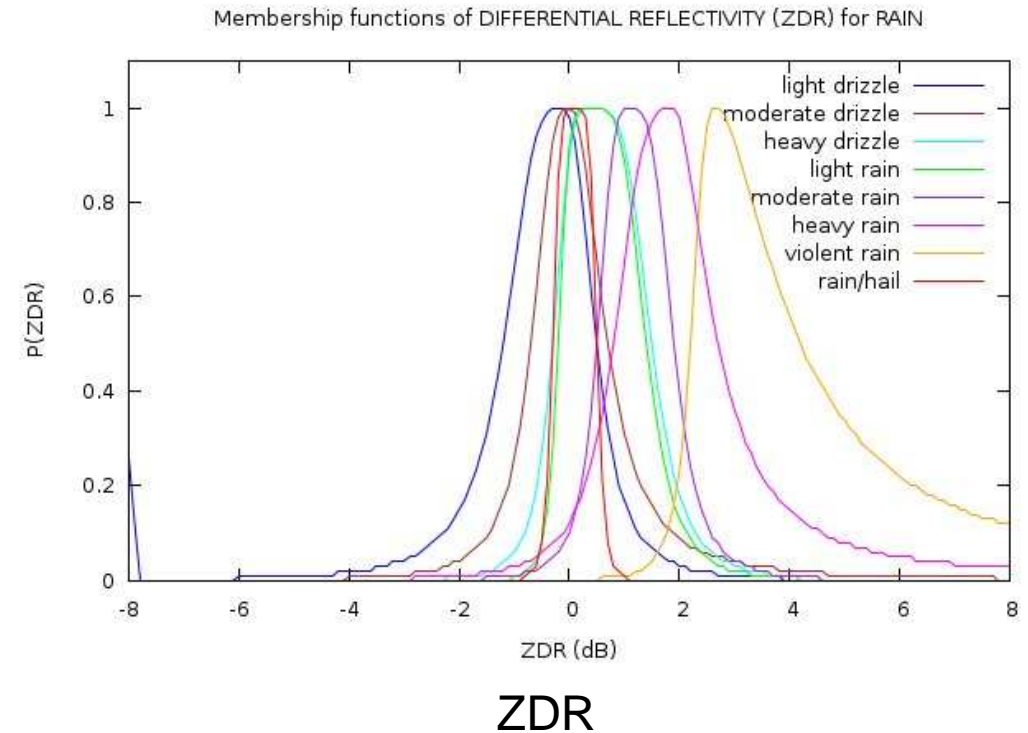
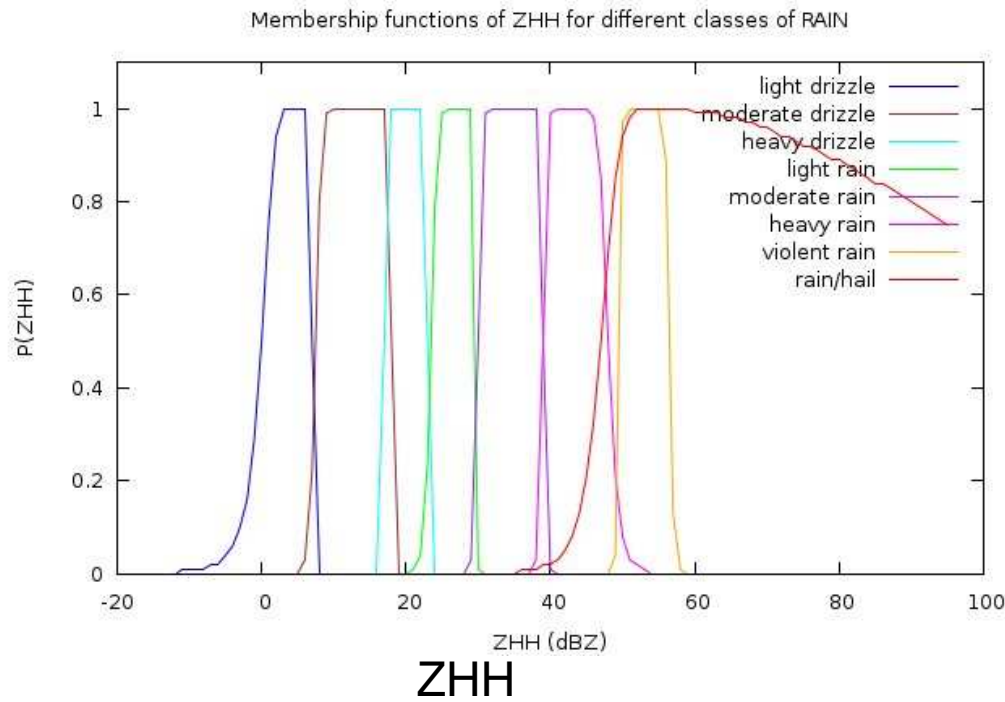
- wet snow–rain mixture,
- hail,
- Graupels.

# Membership functions

Represented by beta-Functions (Bringi & Chandrasekar, 2001)

$$\text{beta}(x,m,a,b) = 1 / [1+\{(x-c)/a\}^2]^b$$

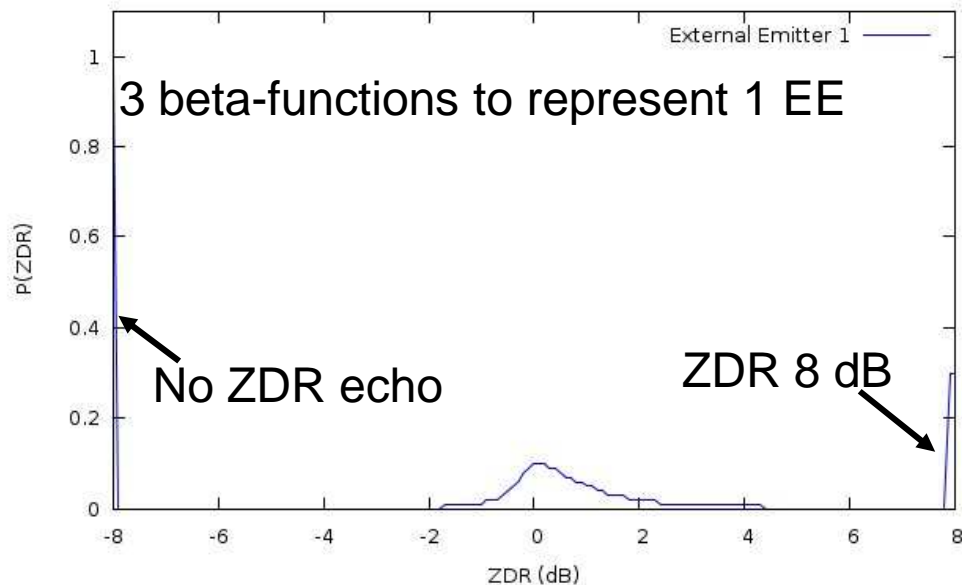
c =centre, a=width, b=slope



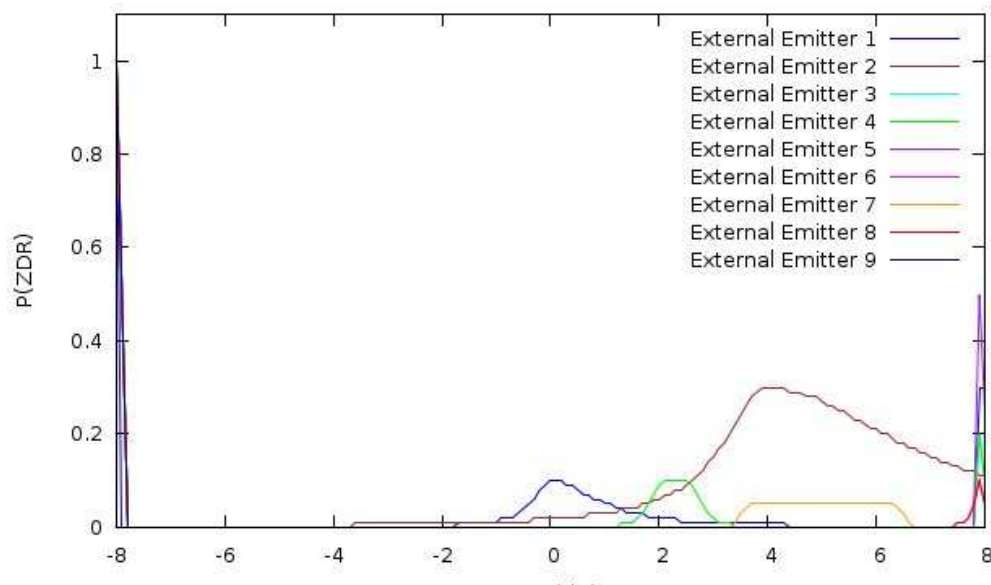
- ZDR depends on ZHH. No relationship established as many sub categories of rain used

# Some strange membership functions !

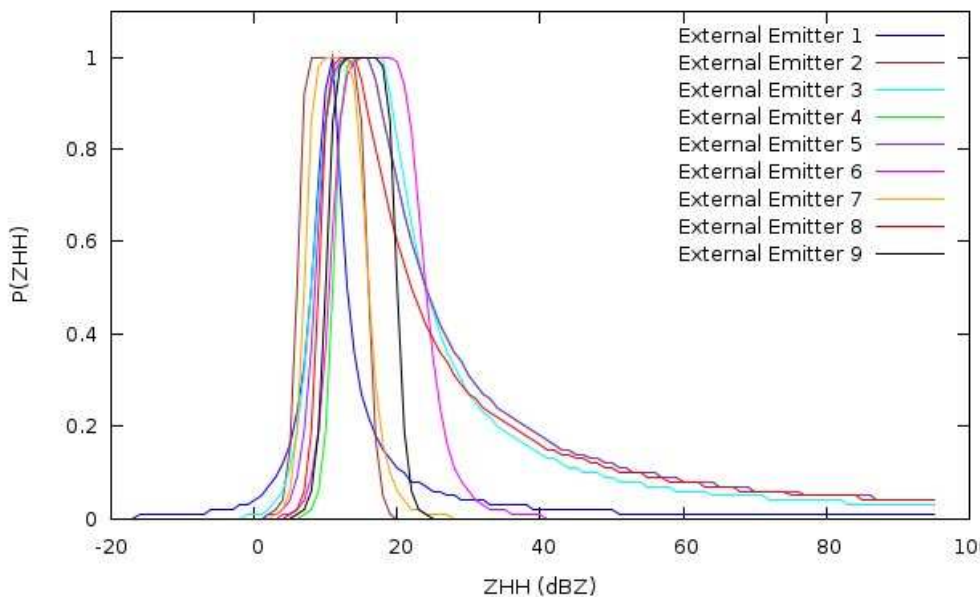
Membership functions of DIFFERENTIAL REFLECTIVITY (ZDR) for EXTERNAL EMITTER 1



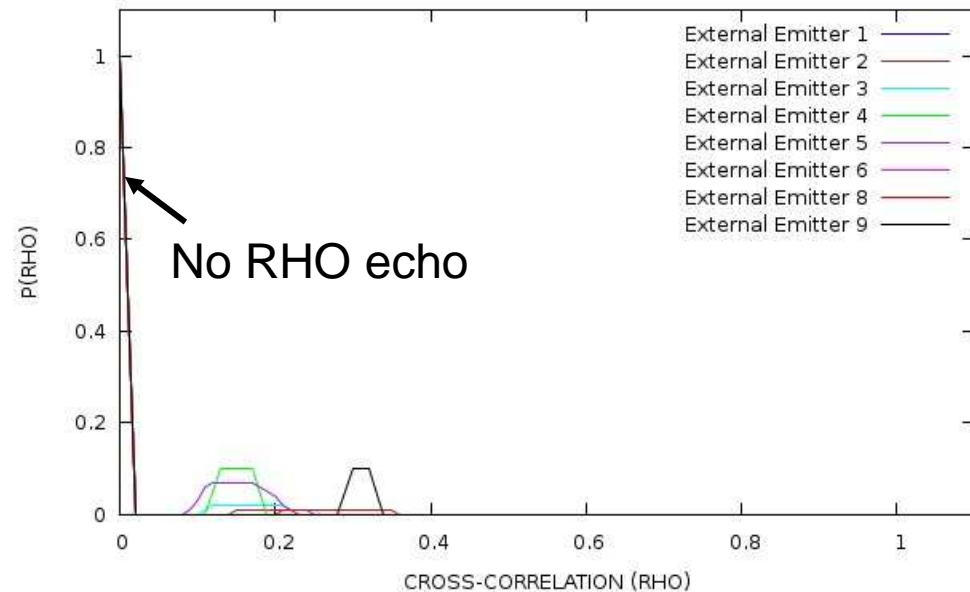
Membership functions of DIFFERENTIAL REFLECTIVITY (ZDR) for all EXTERNAL EMITTER



Membership functions of ZHH for different classes of EXTERNAL EMITTERS

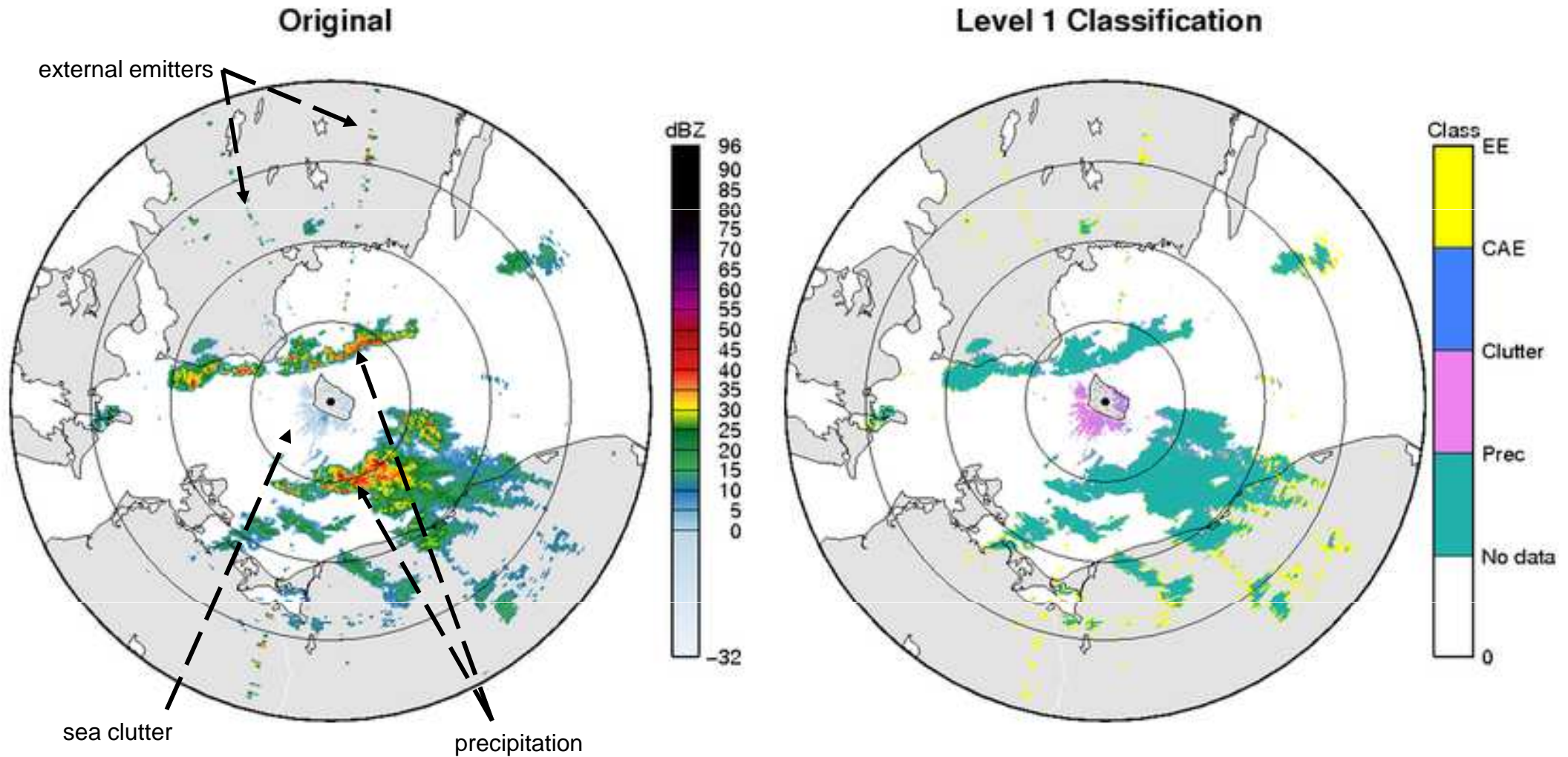


Membership functions of CROSS CORRELATION parameter for EXTERNAL EMITTERS



# Level -1 classification

## Bornholm

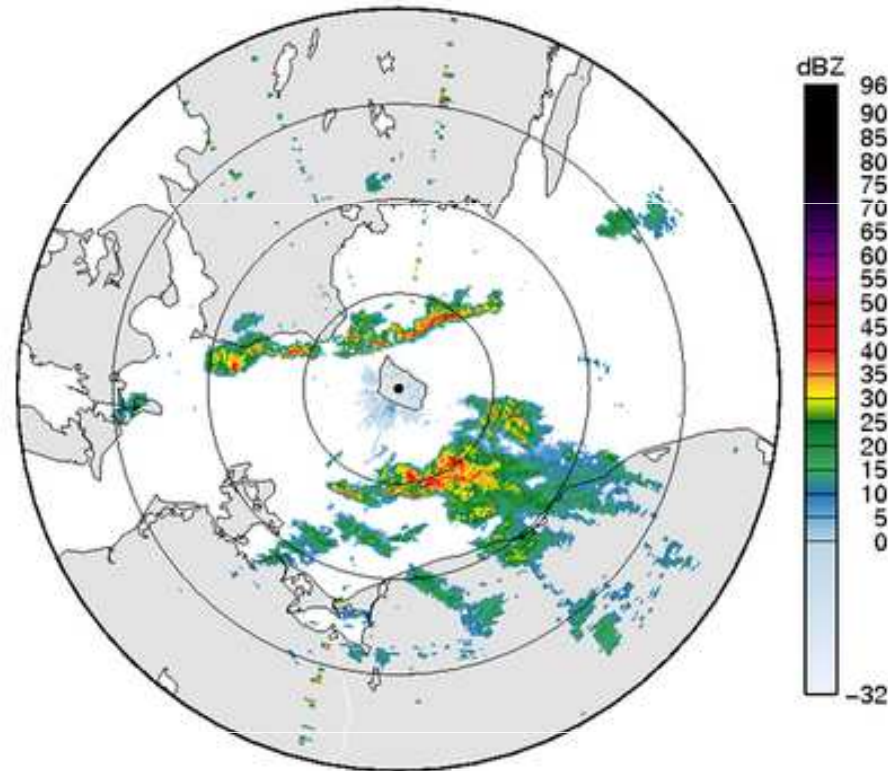


score for e.g., external emitters: 
$$S_j = \frac{(1.0 \cdot Z_{HH} + 1.0 \cdot Z_{HH_{tex}} + 0.8 \cdot Z_{DR} + 0.5 \cdot Z_{DR_{tex}} + 0.0 \cdot \Phi_{DPl_{ext}} + 0.8 \cdot \rho_{HV})}{1.0 + 1.0 + 0.8 + 0.5 + 0.0 + 0.8}$$

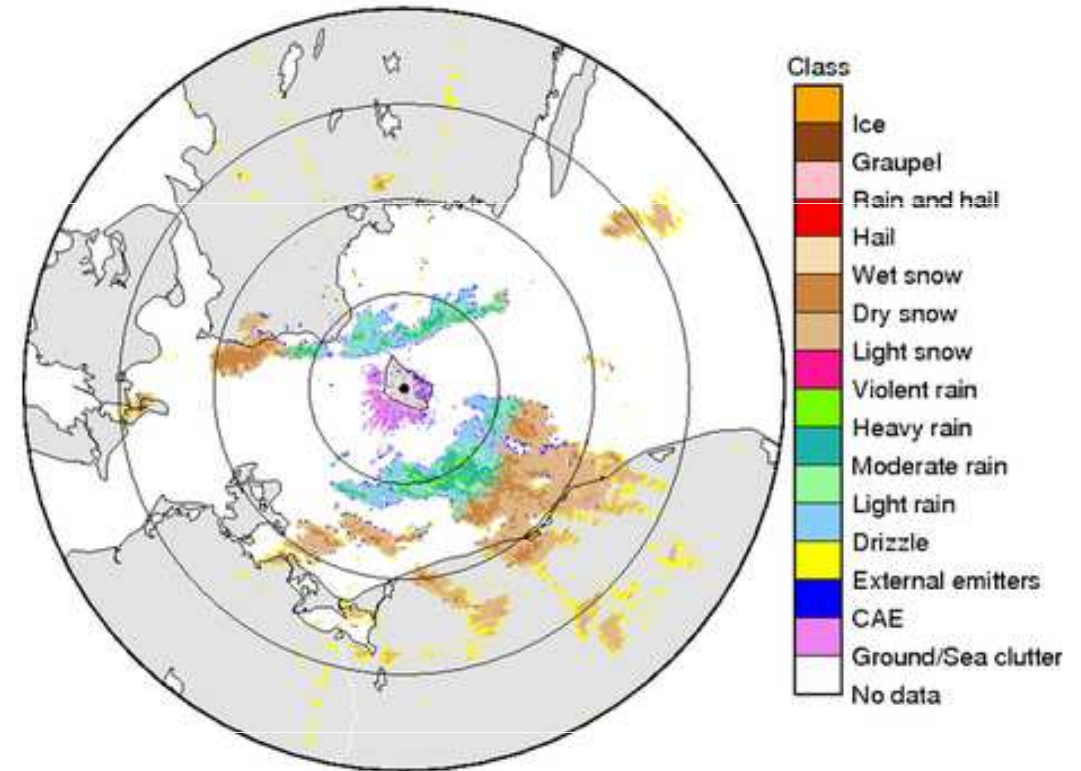
# Level -2 classification

Bornholm

Original



Level 2 Classification



INPUT: precipitation from level 1 classification:  
need NWP melting layer heights

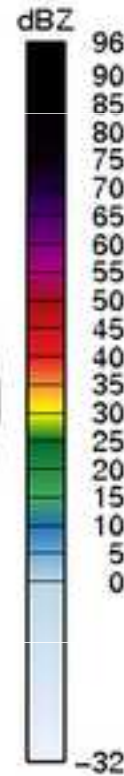
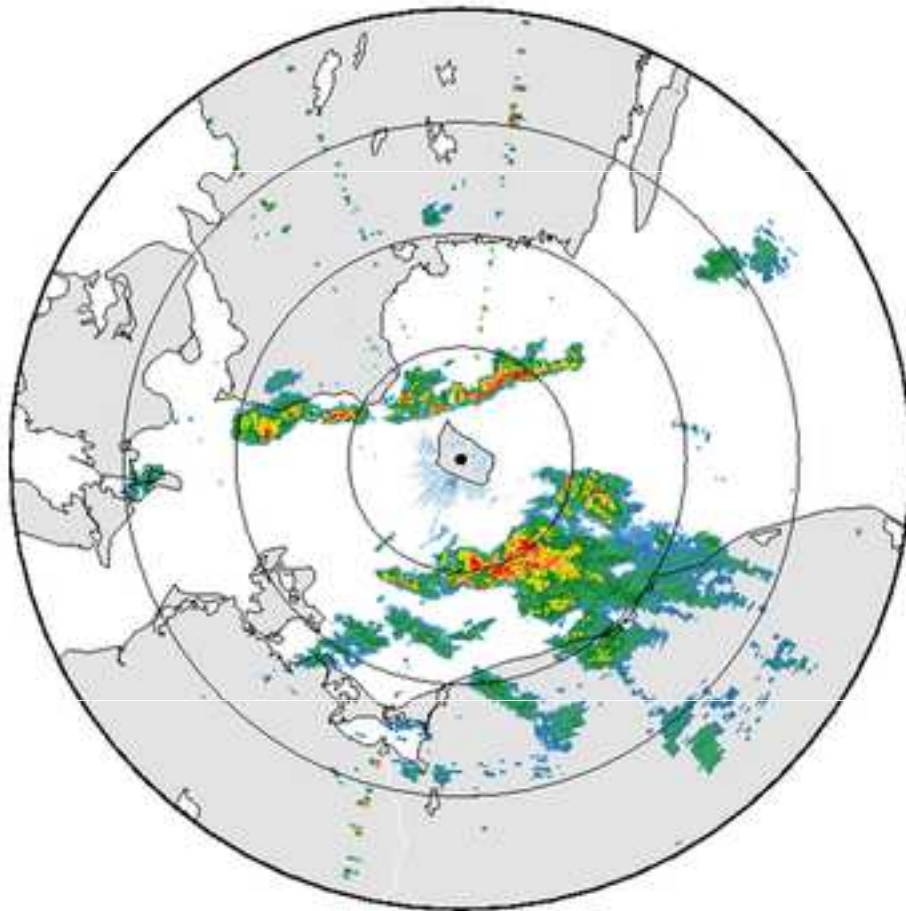
score for e.g., drizzle 
$$S_j = \frac{Z_{HH} \cdot H_{ML} \cdot (1.0 \cdot Z_{DR} + 0.5 \cdot \rho_{HV} + 0.4 \cdot K_{DP})}{1.0 + 0.5 + 0.4}$$



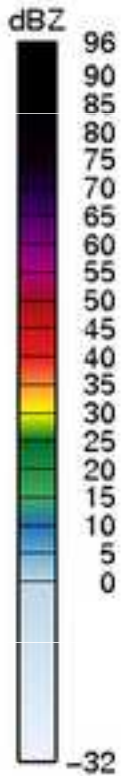
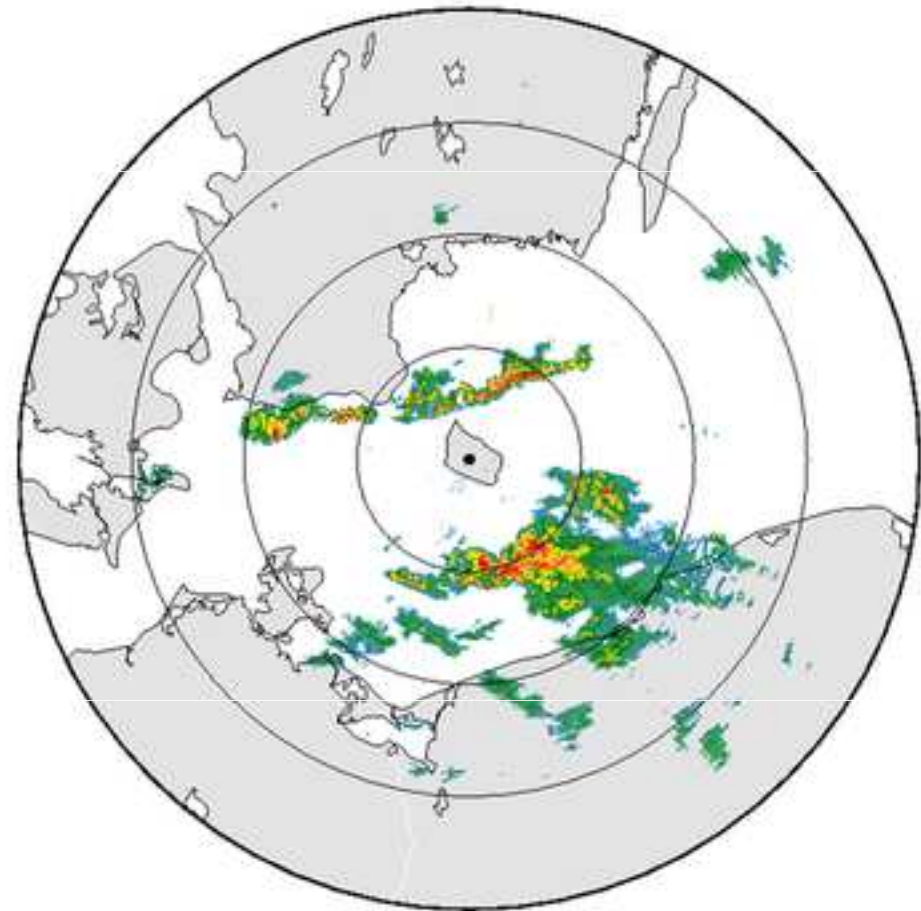
# “Cleaned” Product

## Bornholm

Original



Cleaned



*Most appreciated product by DMI users*

# Finally

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BALTRAD hydrometeor classifier:

- publicly available according to the Lesser Gnu General Public License
- HDF5 file format
- Documentation: Doxygen
- Visit: <http://www.baltrad.eu/>
- Caution: membership functions are derived using the data from the 2 DMI dualPol radars they will need fine tuning when used with data from other radars
- Have realistic expectations : will not get it right 100 % everytime !

Thank you for your attention



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*One of the activities: Development of Dual Pol. classifier*

# NOTE:

## Dual pol. parameters are difference between very small quantities

- Need to reduce noise in the data e.g., smooth – Zdr,  $\rho_{hv}$ ,  $\phi_{dp}$ , Kdp
- Noise is a special problem for Kdp – critical parameter in attenuation correction and rain estimates. smoothed over several km – smooths out peaks
- Need to correct for systematic errors e.g., radome contamination
- Accurate calibration a must.
- For reliable rain rate estimates and HMC need:
  - Zdr within 0.1 – 0.2 dB (source Illingworth, 2004).
  - Zhh within 1 dB for QPE
  - $\phi_{dp}$  within 1 deg. or better
  - $\rho_{hv} \Rightarrow 0.98$  in light to moderate rain. If this is not met then all polarimetric parameters will be affected by noise and the distinction between say rain and melting snow will be difficult. Measured values < theoretical values (OPERA report-WD-2009-1.4a).
- Contamination by wind mills of secondary lobes will affect the quality of measurements made in rain by the main lobes

# 1. Ensure good quality data

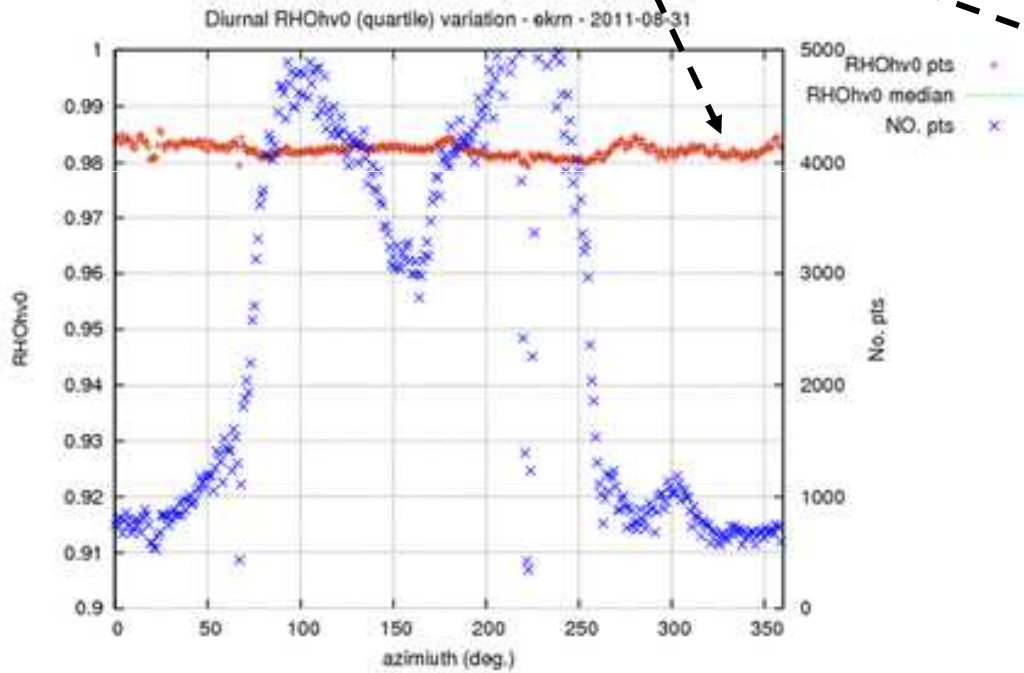
# Radar data quality monitoring tools

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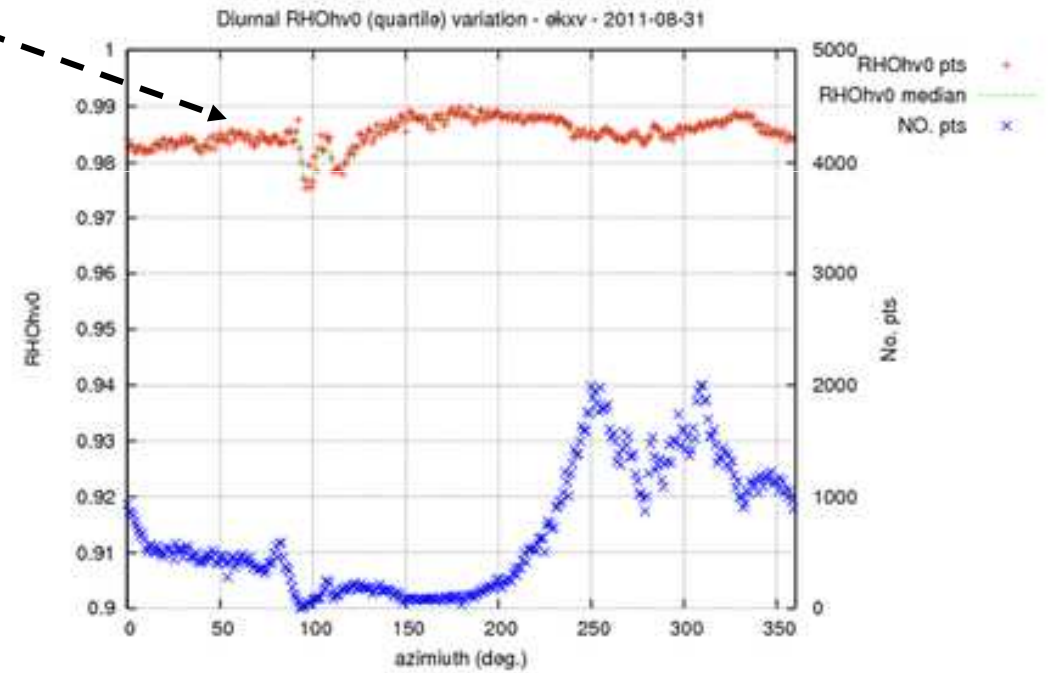


- Special radar scans at  $90^{\circ}$  elevation is performed to compute the potential biases in ZDR
- ZDR computed from diurnal sun hits
- ZDR computed in light rain between 20 dBZ – 22 dBZ at close range
- $\Phi_{dp}$  offsets are computed
- Upper 75% quantile RHV in rain is computed.

Diurnal variations of  $\rho_{HV}$  (colour red) in rain for Bornholm and Virring radars



BORNHOLM radar



VIRRING radar



## Its components:

1. Ensure good quality and “stable” data:
  - *Mitigate radome effects on  $Z_{dr}$ ,  $\Phi_{dp}$*
  - *$Z_{dr}$  offset correction (currently using  $Z_{dr}$  scans at  $90^\circ$  + sun calibration)*
  - *Monitor  $\phi_{dp0}$  offset*
  - *Monitor the quality of  $Z_{dr}$  in light rain (20 dBZ – 22 dBZ) at close range*
  - *Monitor  $phv$  in rain (upper 75% quantile)*
2. Computation of  $K_{DP}$
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4. Computation of the Melting layer (radar and NWP)
5. Fuzzy logics classification scheme:
  - *Computation of the membership functions for each pre-specified radar echo class*

The easy part

