



# Investigation of angular variations of radar sea clutter

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# ONERA ACTIVITIES – Sea surface radar imagery

## Improving our knowledge of the EM scattered signal from the sea surface

- Target detection: Developing robust detection methods under difficult sea conditions (Detection of small targets, rough sea state...)
- Sea clutter: Modelling the EM sea surface response
- Detection/ characterization/ quantification of marine pollutants. (POLLUPROOOF project)
- Inversion of ocean surface parameters (wind/ wave heights/ ocean currents)

### ❑ Collaborative work:

- ❑ ONERA – Research labs (MIO, IETR , ...)
- ❑ DEMR (multi-units/ multi-sites) : Modeling/ radar experimentation/ system expertise



# CONTEXT OF THE STUDY

## Various challenges :

- Modeling of the HH and HV returns
- The variability of the NRCS
- Breaking waves, sea spikes
- Azimuthal variations and directional asymmetries
- The directional wave number spectrum of the short waves
- Grazing angle configuration...

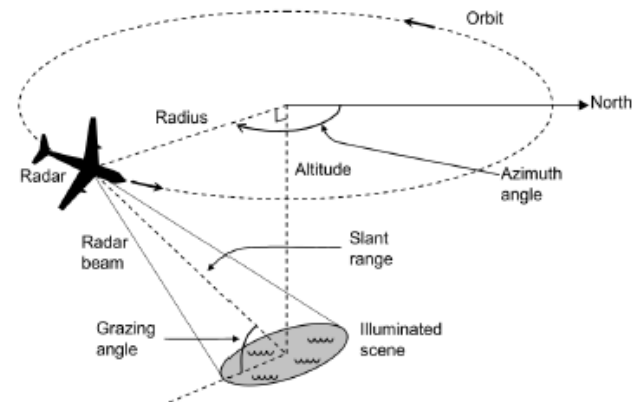
## The purpose:

Recent progresses toward the depiction and simulation of some of these phenomena.

Fully-polarimetric X band radar system maintained & operated within the « **D**efence **S**cience & **T**echnology **O**rganisation »

Frequency	10.1 GHz
Grazing angles	15° à 45°
Range resolution	0.75 m
Cross-range resolution	62 m

*INGARA radar and trial parameters (reproduced from [1])*

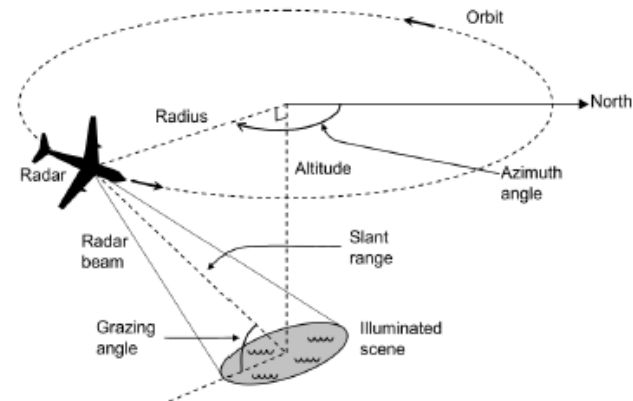


*Circular spotlight mode collection for the INGARA data (reproduced from [1])*

[1] Crisp, D.J., R. Kyprianou, L. Rosenberg, and N.J. Stacy, *Modelling the mean ocean backscatter coefficient in the plateau region at X-band*. Research report, DSTO, 2012.

Fully-polarimetric X band radar system maintained & operated within the « Defence Science & Technology Organisation »

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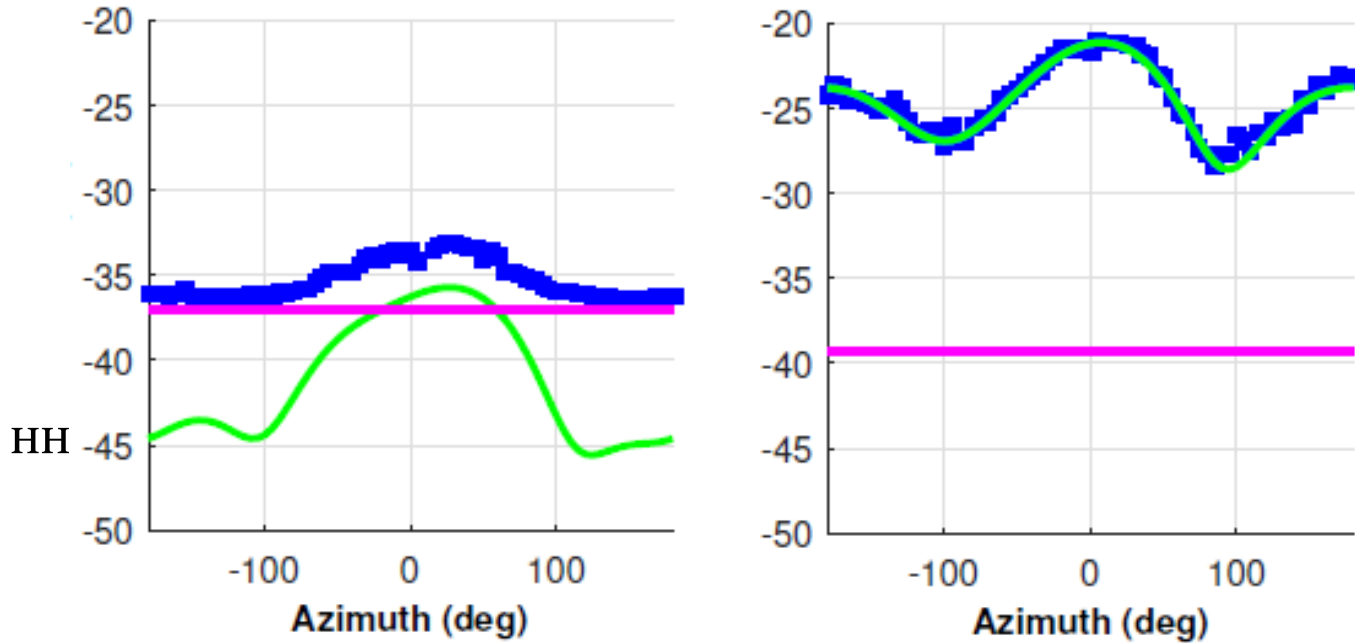
*Circular spotlight mode collection for the INGARA data (reproduced from [1])*

Trial	Flight	Date	Wind		Wave		
			Speed (m/s)	Direction (deg)	Height (m)	Direction (deg)	Period (s)
SCT04	F33	9/8/04	10.2	248	4.9	220	12.3
SCT04	F34	10/8/04	7.9	248	3.5	205	11.8
SCT04	F35	11/8/04	10.3	315	2.6	210	10.4
SCT04	F36	12/8/04	13.6	0	3.2	293	8.8
SCT04	F37	16/8/04	9.3	68	2.5	169	9.7
SCT04	F39	20/8/04	9.5	315	3.0	234	11.4
SCT04	F40	24/8/04	13.2	22	3.8	254	12.2
SCT04	F42	27/8/04	8.5	0	4.3	243	12.5
MAST06	F2	17/5/06	8.5	115	0.62	112	3.1
MAST06	F4	19/5/06	3.6	66	0.25	35	2.6
MAST06	F8	23/5/06	3.5	83	0.41	46	4.0
MAST06	F9	24/5/06	10.2	124	1.21	128	4.6

*Wind and wave ground truth for the Ingara data (reproduced from [1])*

[1] Crisp, D.J., R. Kyprianou, L. Rosenberg, and N.J. Stacy, *Modelling the mean ocean backscatter coefficient in the plateau region at X-band*. Research report, DSTO, 2012.

# Noise floor and denoising process



*Azimuthal variation for HH polarized data for nominal grazing angles of 15° (left panel) and 45° (right panel) for a wind speed of 8.5 m/s*

Raw NRCS  
Mean noise estimate  
Denoised NRCS

Upwind = 0°  
Downwind = +/- 180°  
Crosswind = +/- 90°

# Azimuthal variation of the NRCS : Maximum Likelihood estimation

$$\sigma_0^{model}(\phi_n) = \tilde{\sigma}_0(\phi_n) + b(\phi_n)$$

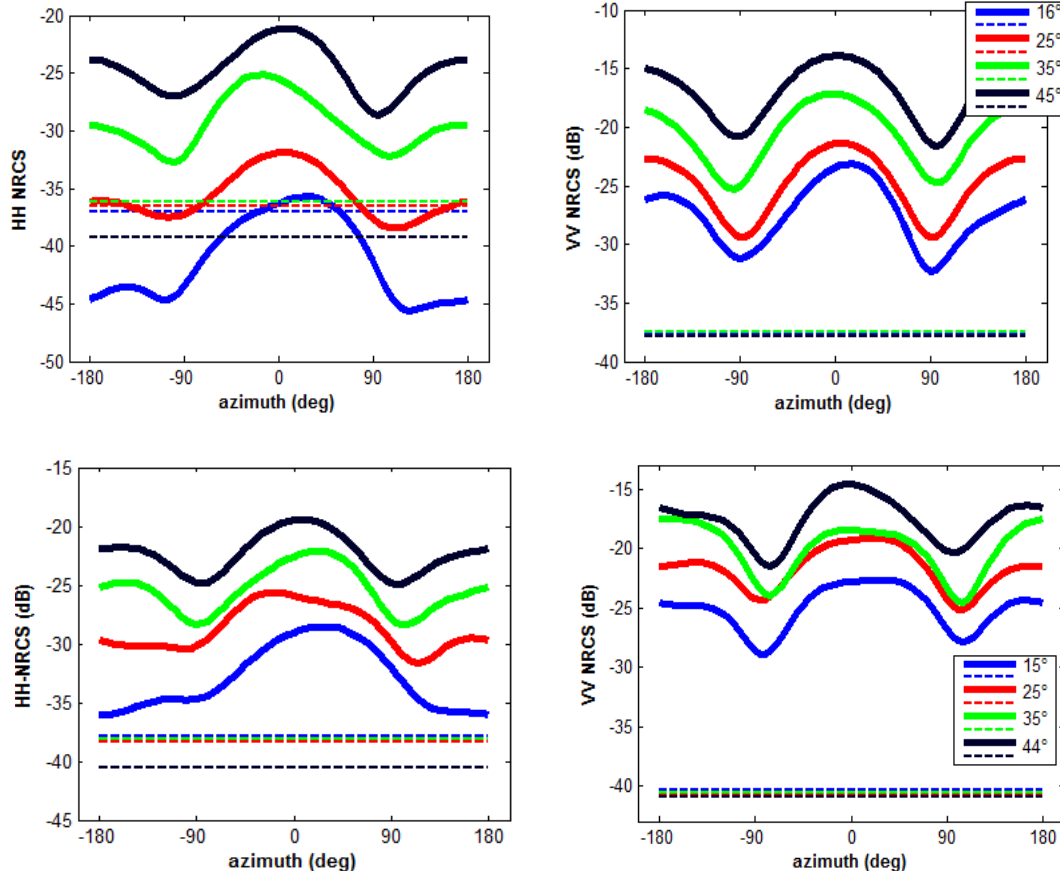
Model: Truncated Fourier series  $\tilde{\sigma}_0(\phi_n) = a_0 + \sum_{k=1}^4 a_k \cos(k(\phi_n - \delta_k))$

Log-likelihood:

$$\mathcal{L} = -\frac{1}{2} \sum_{n=1}^{N_a} \log(2\pi\sigma_0^2) - \sum_{n=1}^{N_a} \frac{1}{2\sigma_b^2} [\sigma_0^{data}(\phi_n) - (\tilde{\sigma}_0(\phi_n) + \bar{b})]^2$$

$$\frac{\partial \mathcal{L}}{\partial a_k} = 0, \frac{\partial \mathcal{L}}{\partial \phi_k} = 0 \dots \longrightarrow a_n, \phi_n$$

# Azimuthal variation of the NRCS : HH peculiar behavior at low grazing angles



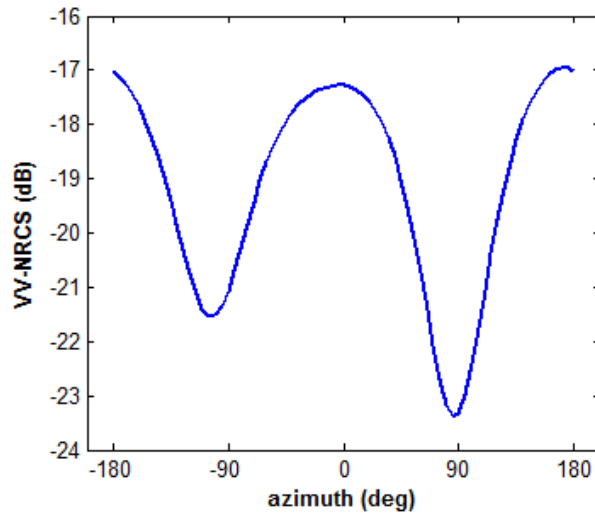
Progressive shift from two local maxima at upwind/downwind directions to a unique and pronounced maximum in the upwind direction

→ Physical interpretation?

*Azimuthal variation for HH and VV polarized data for nominal grazing angles for two different wind speeds (8.5 m/s for the upper panels and 10 m/s for the lower ones)*



# Azimuthal variation of the NRCS : *Directional asymmetries*



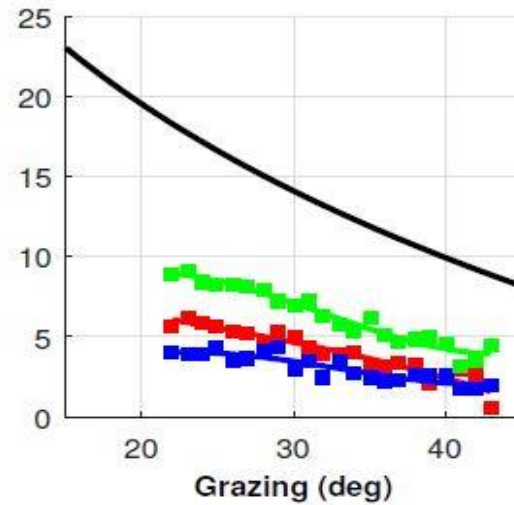
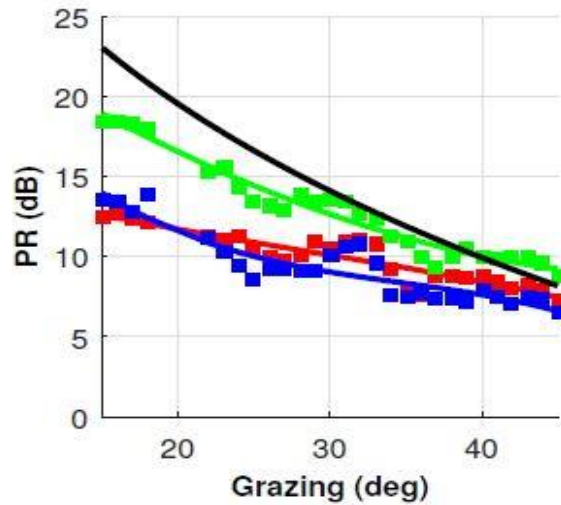
Example of the azimuthal variation for a 41° grazing angle, run3

## Conclusions :

- UDA and UCA in VV and HH are maximum at moderate grazing angle (30° - 45°)
- $UDA_{HH} > UDA_{VV}$  &  $UCA_{VV} > UCA_{HH}$  (The maximum UDA in HH is in average about 2 dB higher than the VV counterpart.)

- Upwind/Downwind asymmetry :  $UDA = 10 \log_{10} \left( \frac{\sigma_{up}^0}{\sigma_{down}^0} \right)$
- Upwind/Crosswind asymmetry :  $UCA = 10 \log_{10} \left( \frac{\sigma_{up}^0}{\sigma_{cross}^0} \right)$

# Relations between the different polarizations : Polarization ratio – Grazing and azimuth behavior

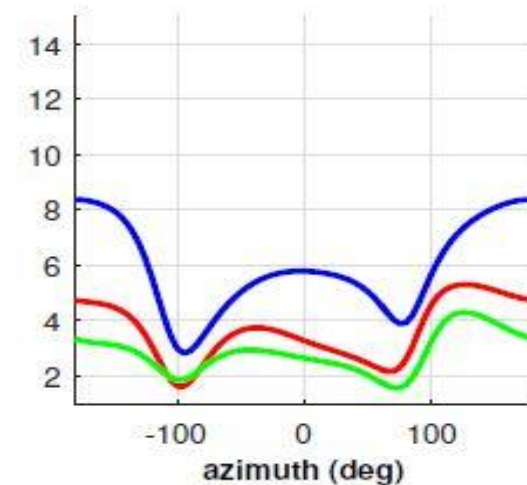
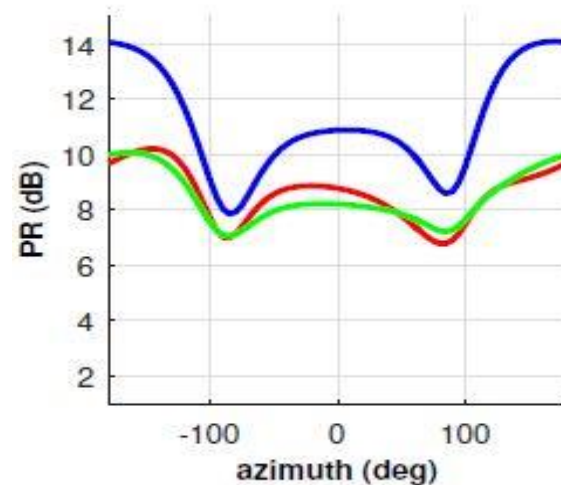


crosswind  
upwind  
downwind  
Bragg

$$PR = (\sigma_{VV}^0)_{dB} - (\sigma_{HH}^0)_{dB}$$

## Conclusions :

- The PR is a decreasing function of grazing angle
- $PR_{data} < PR_{Bragg}$
- PR has a strong azimuthal dependency with a sharp maximum in the downwind direction



Grazing angles  
25°  
37°  
42°

# Polarization ratio of asymmetric wave

## Upwind & downwind

Polarization ratio using Bragg theory for a nominal incidence angle  $\theta$

$$\begin{cases} B_{VV} = \frac{\varepsilon-1}{(\varepsilon q_0 + q'_0)^2} (-q'_0{}^2 - \varepsilon k_0^2) \\ B_{HH} = \frac{\varepsilon-1}{(q_0 + q'_0)^2} K^2 \end{cases}, \text{ With } \begin{cases} k_0 = K \sin\theta \\ q_0 = K \cos\theta \\ q'_0 = \sqrt{\varepsilon K^2 - k_0^2} \end{cases}$$

$$PR_{Bragg}(\theta) = \frac{|B_{VV}|^2}{|B_{HH}|^2} = \frac{|q_0 + q'_0|^4}{|\varepsilon q_0 + q'_0|^4} [\sin^2 \theta (1 - \varepsilon) - \varepsilon]^2$$

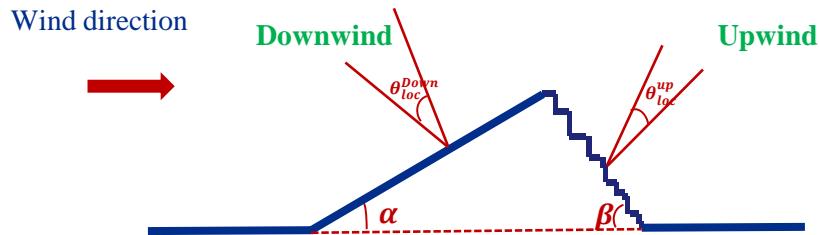
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At local incidence angles:

$$PR_{loc} = PR(\theta_{loc}), \theta_{loc} = \begin{cases} \theta_i - \alpha & \text{downwind} \\ \theta_i - \beta & \text{upwind} \end{cases}$$

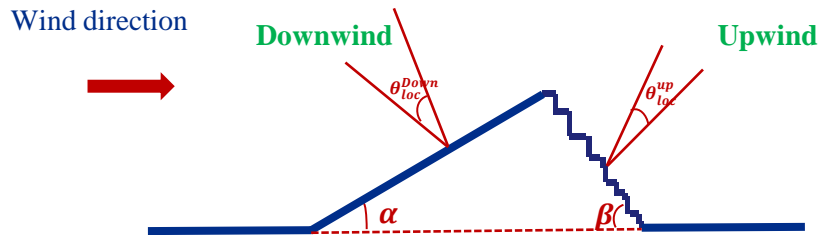
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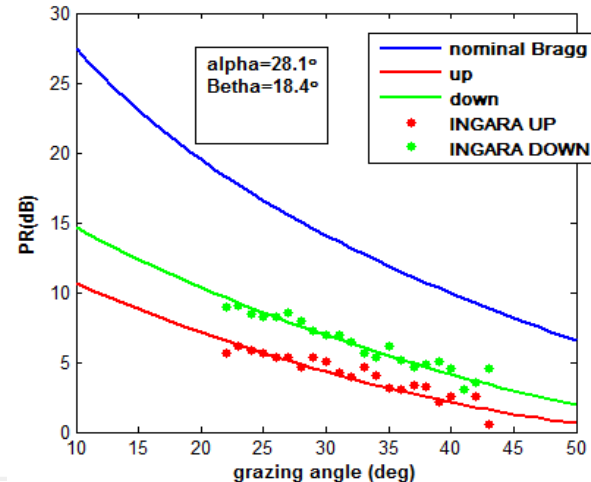
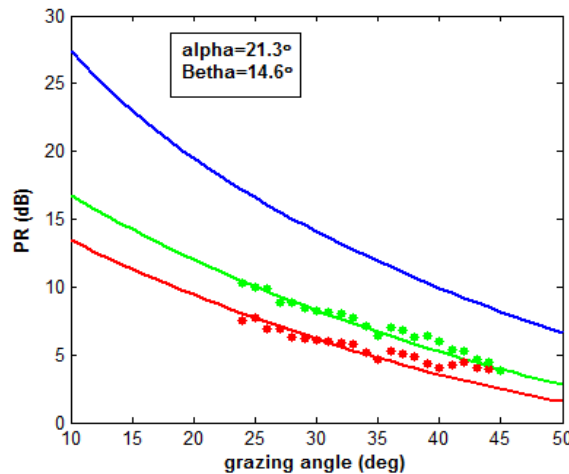
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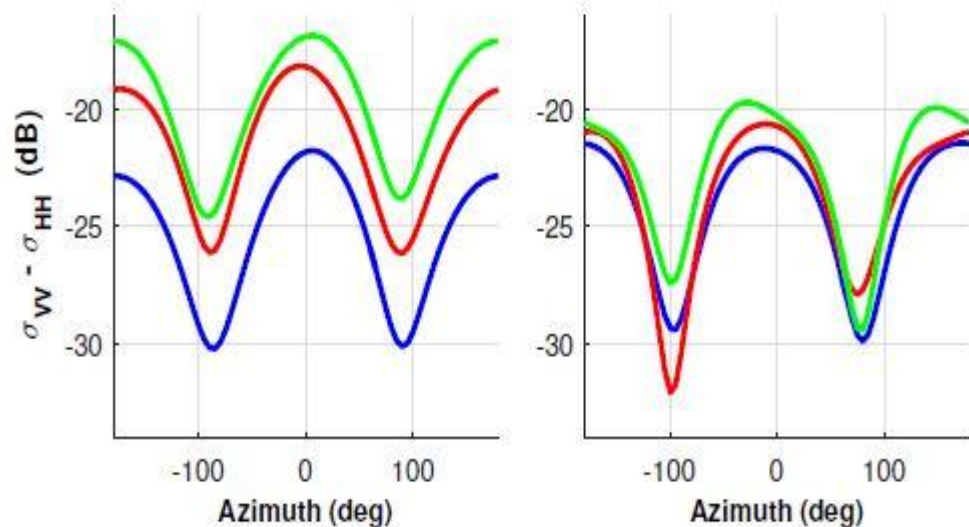
$\alpha$  and  $\beta$  angles are in good agreement with slopes obtained in wind-wave tank measurements (Cf Caulliez et al <sup>(2)</sup>)

[2] Caulliez, G., and C.-A. Guerin (2012), Higher-order statistical analysis of short wind-waves, J. Geophys. Res., 117, C06002, doi:10.1029/2011JC007854.

# Relations between the different polarizations :

The polarization difference  $\sigma_{VV}^0 - \sigma_{HH}^0$

- $\sigma_0 = \sigma_0^p + \sigma_0^{np}$  (linear units)
- $PD = \sigma_{VV}^0 - \sigma_{HH}^0$  removes the non-polarized contribution



Grazing angles

25°

37°

42°

**No or weak UDA  
asymmetry!**

**Potential Interpretation:**

UDA asymmetry is likely to be contained in the non-polarized part and presumably related to the large scales of surface roughness?

*Azimuthal variation of the polarization difference VV-HH for run days 9 (left) and 12 (right)*

# Study of the cross-polarized data

## Scattering models

- GOSSA [3] for the two-like polarizations
- SSA2 [4] for the cross-polarized data

## Spectral models

### Omni-directional spectra

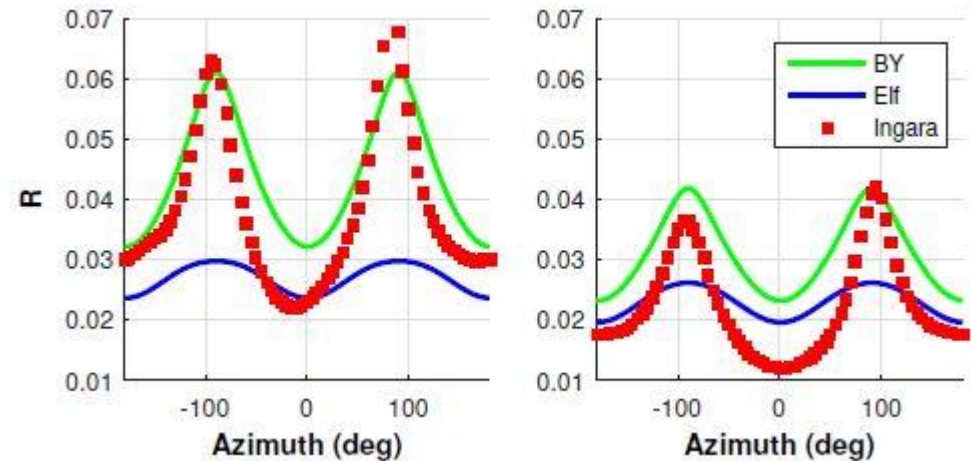
- Elfouhaily [5]
- Bringer [6]

### spreading functions

- Elfouhaily [5]
- Yurovskaya [7]

## Azimuthal variation of the ratio

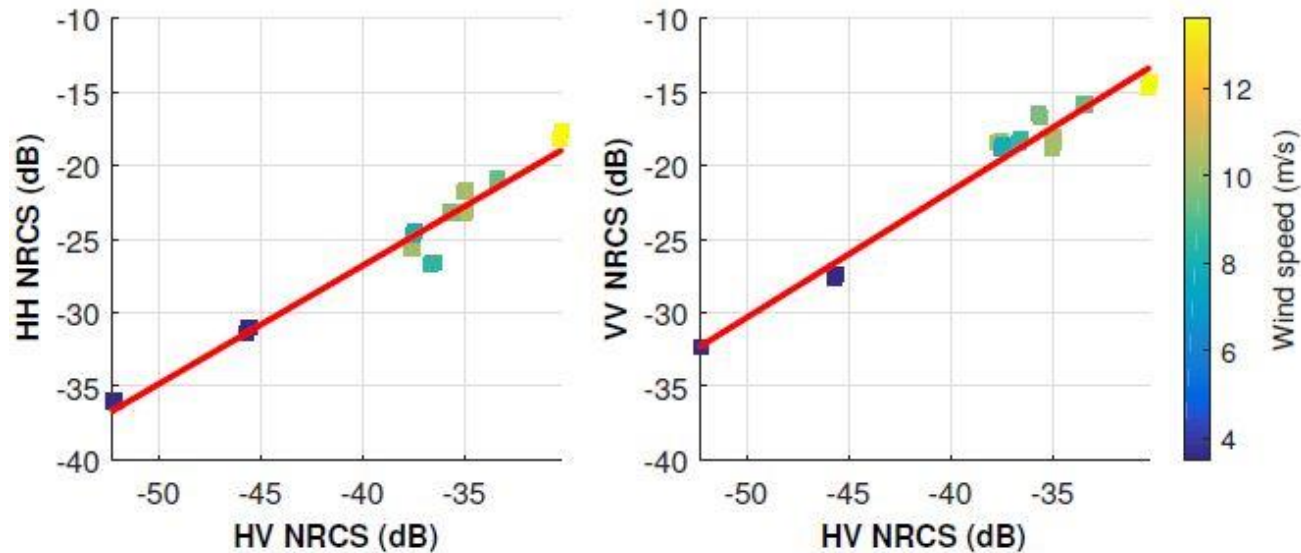
$$R = \frac{\sigma_{VH}^0}{\sigma_{VV}^0 - \sigma_{HH}^0} \propto mSS_y$$



*Azimuthal variation of the Ratio at 40° grazing angle for run days 3 (left) and 9 (right)*

- [3] G. Soriano and C.A. Gu'erin, "A cutoff invariant two-scale model in electromagnetic scattering from sea surfaces," *Geoscience and Remote Sensing Letters, IEEE*, vol. 5, no. 2, pp. 199–203, 2008.
- [4] C.-A. Gu'erin and J.-T. Johnson, "A simplified formulation for the crosspolarized backscattering coefficient under the second-order small slope approximation," *IEEE Trans. Geosci. and Remote Sens.*, 2015
- [5] T. Elfouhaily and C.A. Gu'erin, "A critical survey of approximate scattering wave theories from random rough surfaces," *Waves in Random and Complex Media*, 2004.
- [6] A. Bringer, B. Chapron, A. Mouche, and C.-A. Gu'erin, "Revisiting the short-wave spectrum of the sea surface in the light of the weighted curvature approximation," *IEEE Trans. Geosci. and Remote Sens.*, 2014.
- [7] MV Yurovskaya, VA Dulov, Bertrand Chapron, and VN Kudryavtsev, "Directional short wind wave spectra derived from the sea surface photography," *Journal of Geophysical Research: Oceans*, 2013.

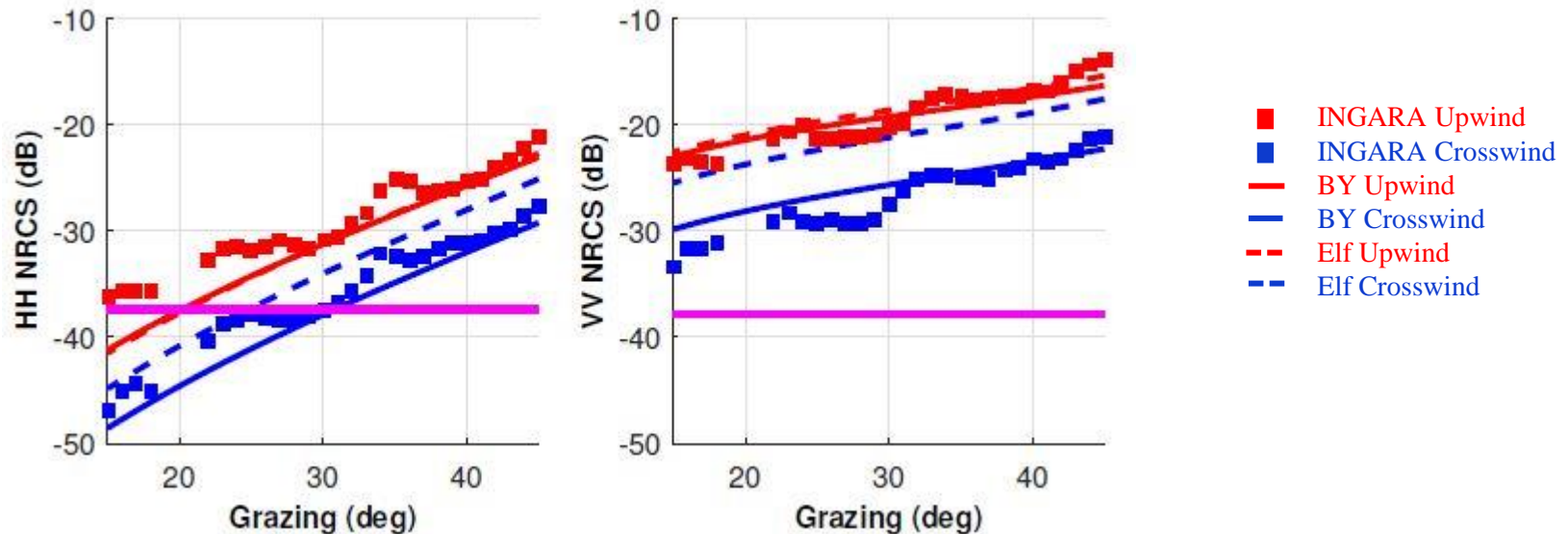
- Systematic correlation between the *HH* & *HV* polarizations ( $\rho > 0.9$ )
- Poorer correlation between the *VV* and *HV* channels ( $\rho < 0.8$ ), albeit following the same trend



*Scatterplot of HH versus HV (left) and VV versus HV (right) for the mean NRCS taken at 37 degrees grazing angle within  $\pm 2.5$  degrees from the upwind direction with linear fit shown in red.*



➔ Significant improvement of the simulated HH and VV NRCS brought by the use of the improved spectral models



*HH (left) and VV (right) NRCS from the INGARA MGA data for run day 9. Superimposed is the simulated NRCS according to the GO-SSA model with Elfouhaily directional spectrum and Bringer-Yurovskaya model.*

# Conclusion

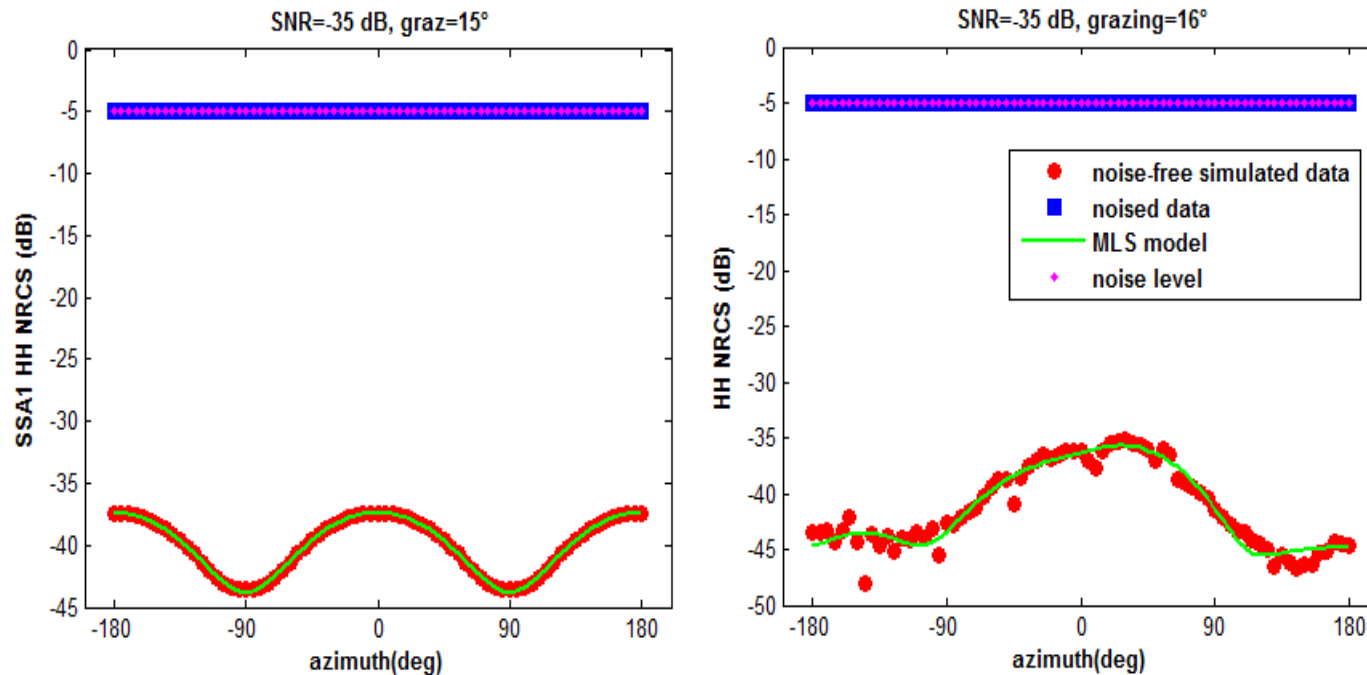
- Peculiar azimuthal distribution at low grazing angles for HH-polarized data
- UDA & UCA asymmetries are not monotone functions of grazing angle and reach their maximum at moderate grazing angles (30°-45°)
- $UDA_{HH} > UDA_{VV}$  &  $UCA_{VV} > UCA_{HH}$
- PR max at downwind
- $\frac{\sigma_{VH}^0}{\sigma_{VV}^0 - \sigma_{HH}^0}$  maximum at crosswind and no or weak UDA for the  $\sigma_{VV}^0 - \sigma_{HH}^0$
- Eventual correlation between HH and HV polarized data
- Improvement of the co-polarized simulated NRCS brought by the use of improved spectral models



THANK YOU FOR YOUR  
ATTENTION

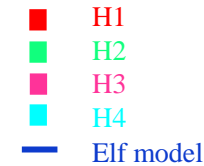
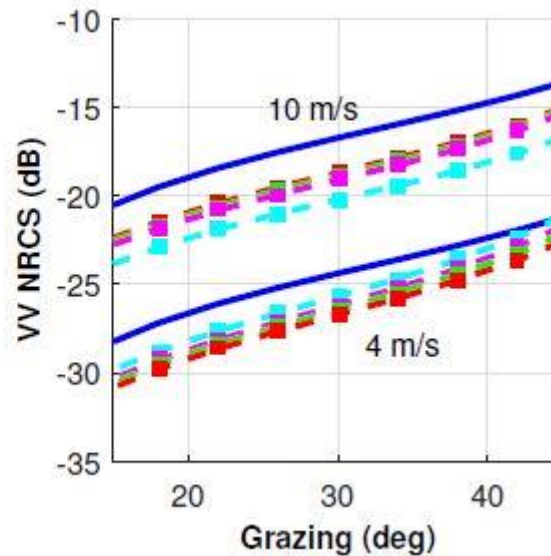
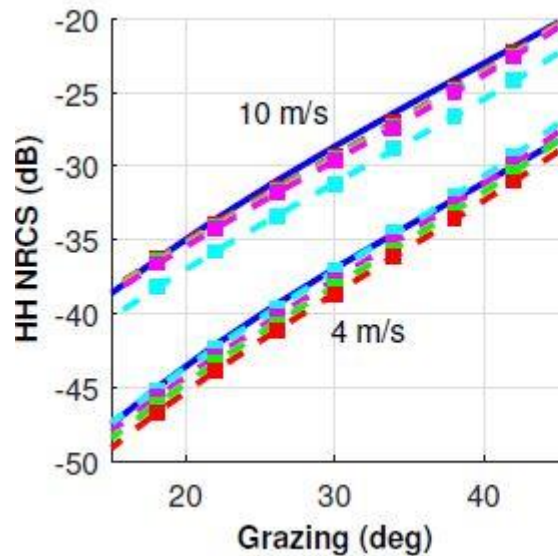
QUESTIONS?

## Robustness of the MLE to the SNR degradation



*Example of NRCS reconstruction at low SNR of -35 dB*

The RMSE calculated between the noise-free simulated data and the estimated model is found to be significantly low and quite insensitive to the SNR.



A slightly more pronounced effect in the HH pol and at smaller wind speeds

VV(upper dots) and HH (lower dots) NRCS for the Hwang spectrum with different swell indices for a 4m/s wind speed on the left panel and 10m/s on the right panel