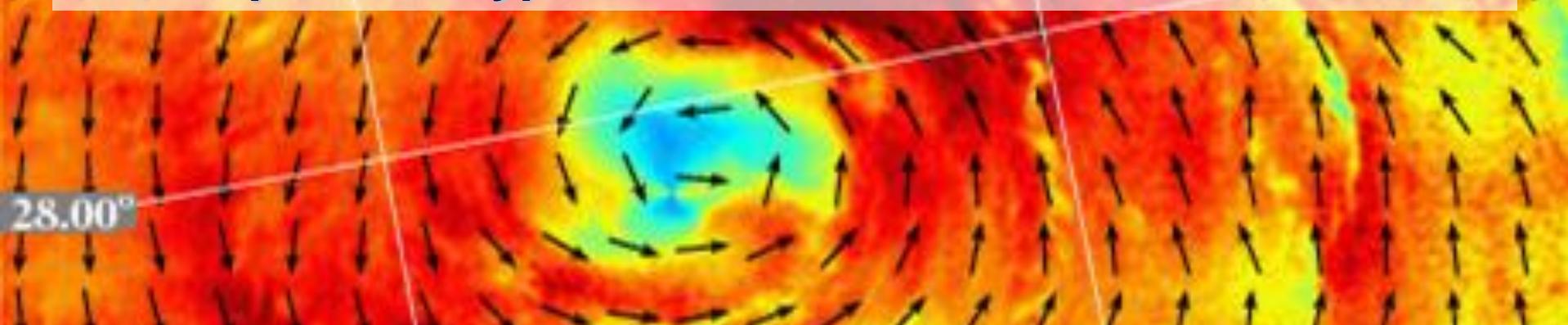


# Wind Retrieval from Synthetic Aperture Radar Operating at Cross Polarization

ONR DRI 32 ITOP

Impacts of Typhoons on the Ocean in the Pacific



J. Horstmann<sup>1,2</sup>, S. Falchetti<sup>2</sup> C. Wackerman<sup>3</sup>,  
R. Foster<sup>4</sup>, M. Caruso<sup>5</sup> and H. Graber<sup>5</sup>

<sup>1</sup>Helmholtz-Zentrum Geesthacht, Germany

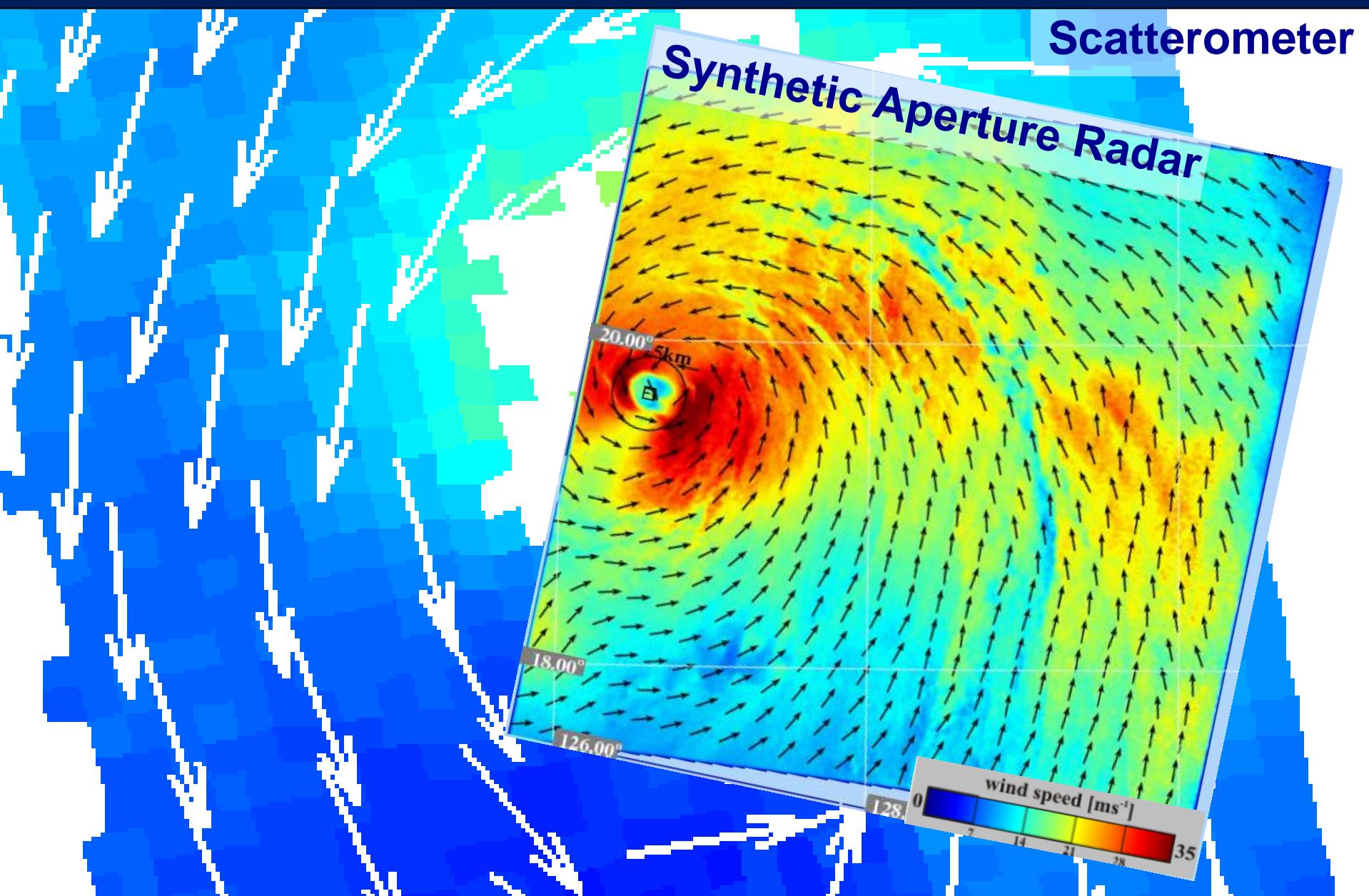
<sup>2</sup>Center for Maritime Research and Experimentation, Italy

<sup>3</sup>General Dynamics, USA

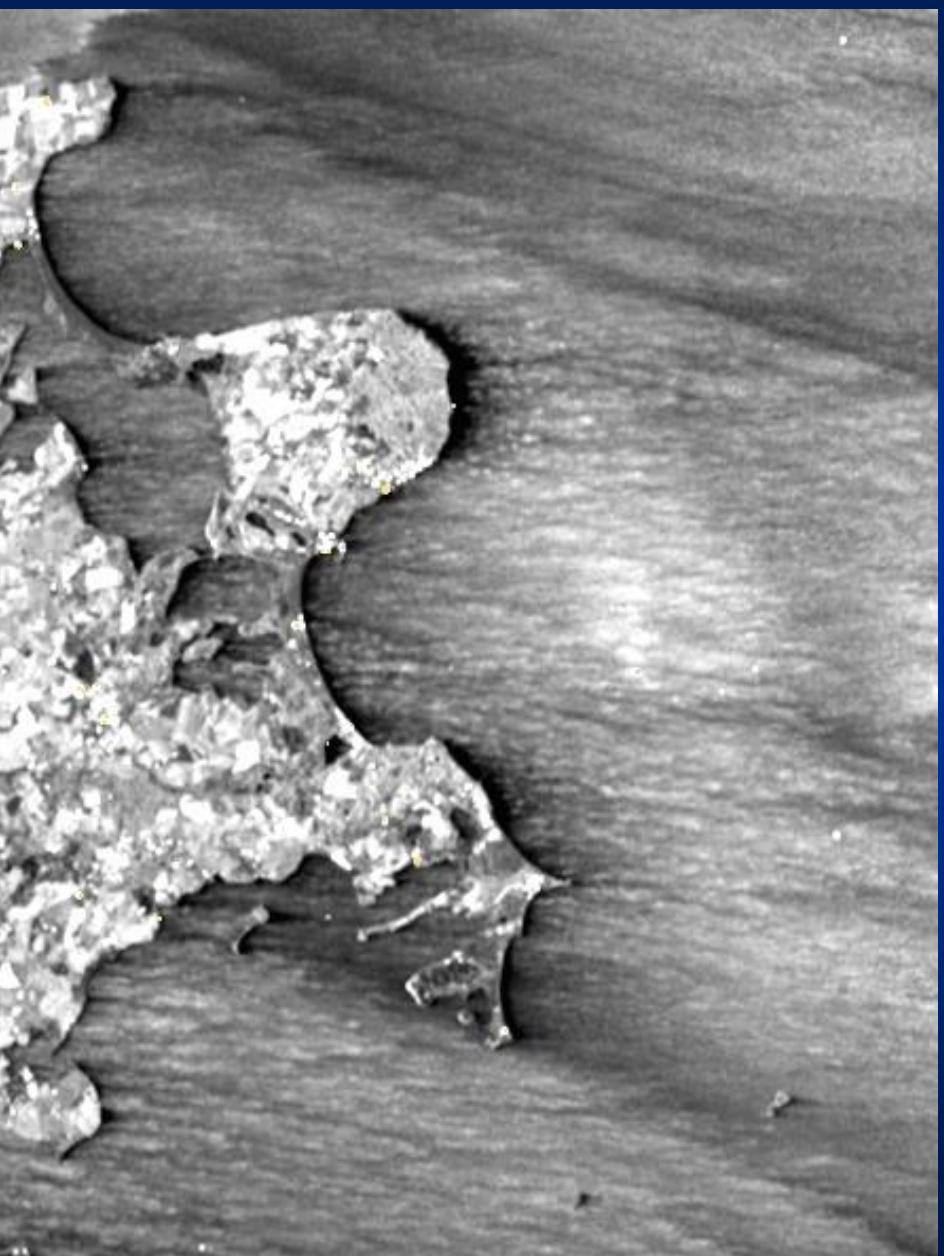
<sup>4</sup>APL, University of Washington, USA

<sup>5</sup>Center for Southeastern Tropical Advanced Remote Sensing, USA

# Why SAR for Wind Field Retrieval



# SAR Wind Direction Retrieval via the Local Gradient Method (WiSAR)

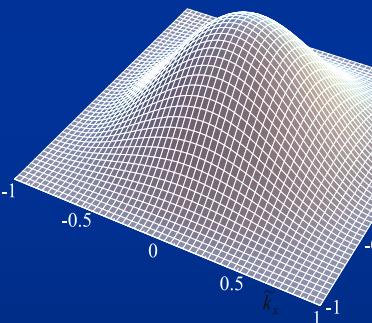


## Local Gradient Method

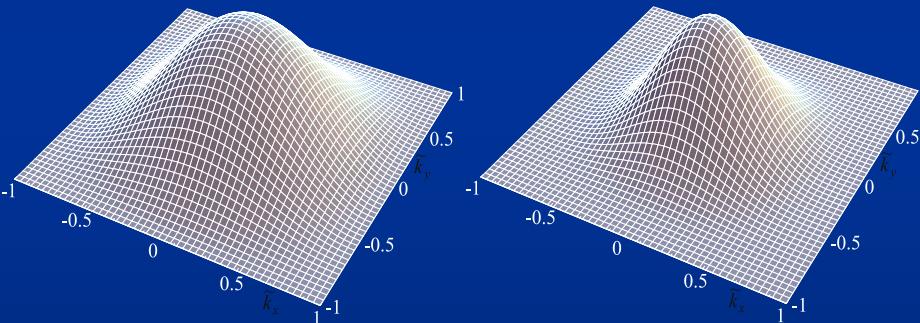


### Binomial filter

2 dim.  $B^2$  Filter



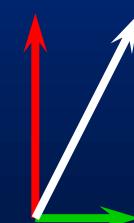
2 dim.  $B^4$  Filter



### Optimized Sobel-Filter

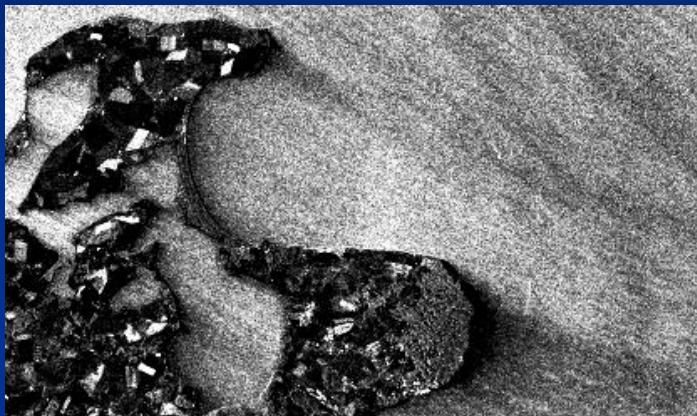
$$\begin{matrix} 3 & 0 & -3 \\ 10 & 0 & -10 \\ 3 & 0 & -3 \end{matrix}$$

$$\begin{matrix} 3 & 10 & 3 \\ 0 & 0 & 0 \\ -3 & -10 & -3 \end{matrix}$$

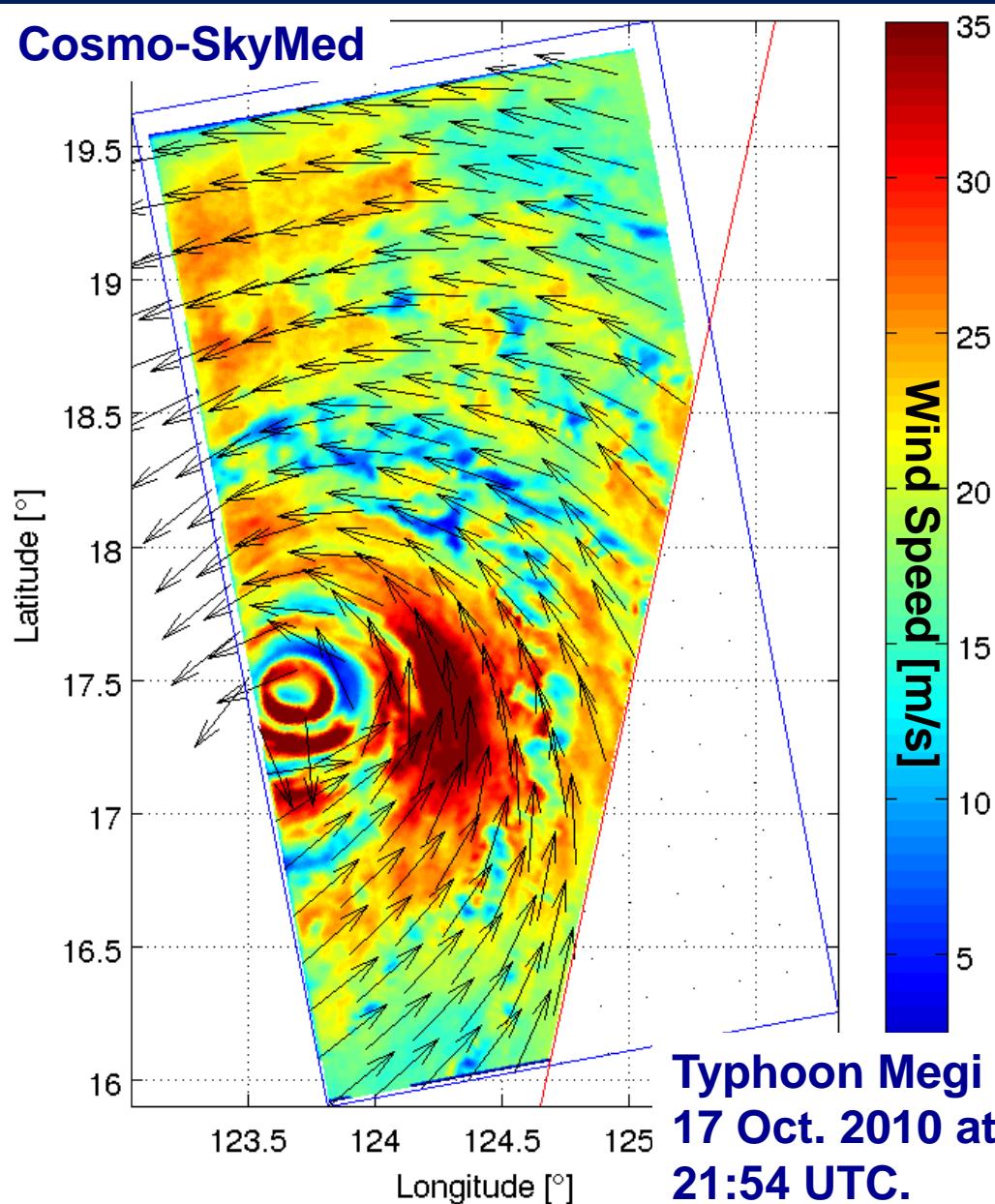
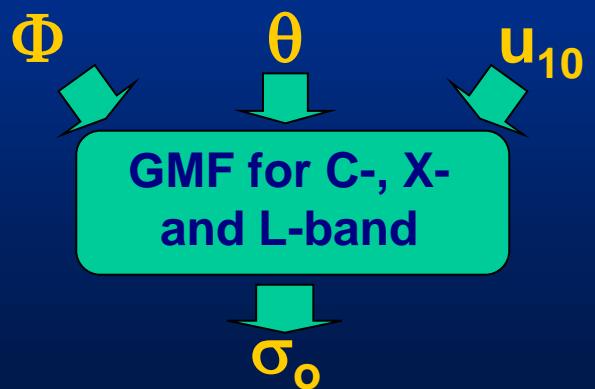


# SAR Wind Speed Retrieval via a Geophysical Model Function (GMF)

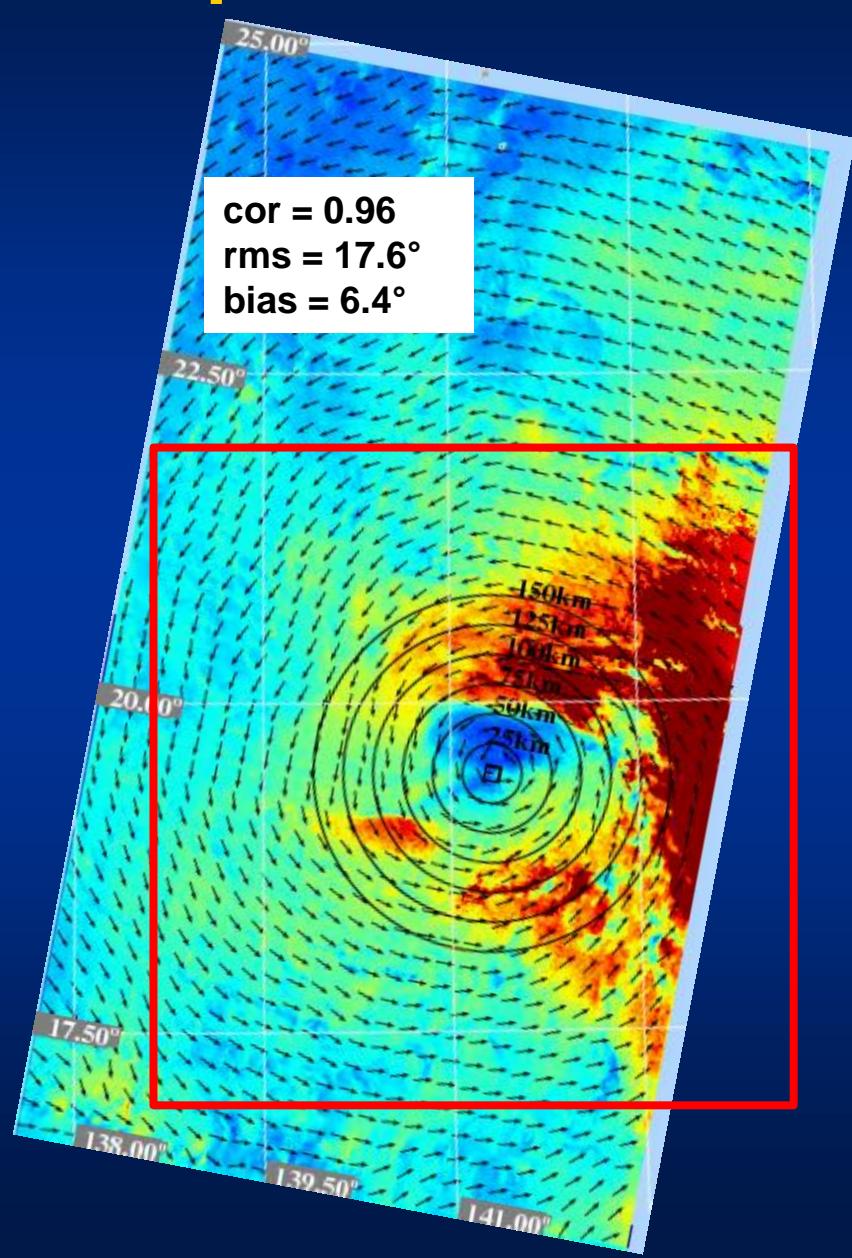
## Geophysical Model Function



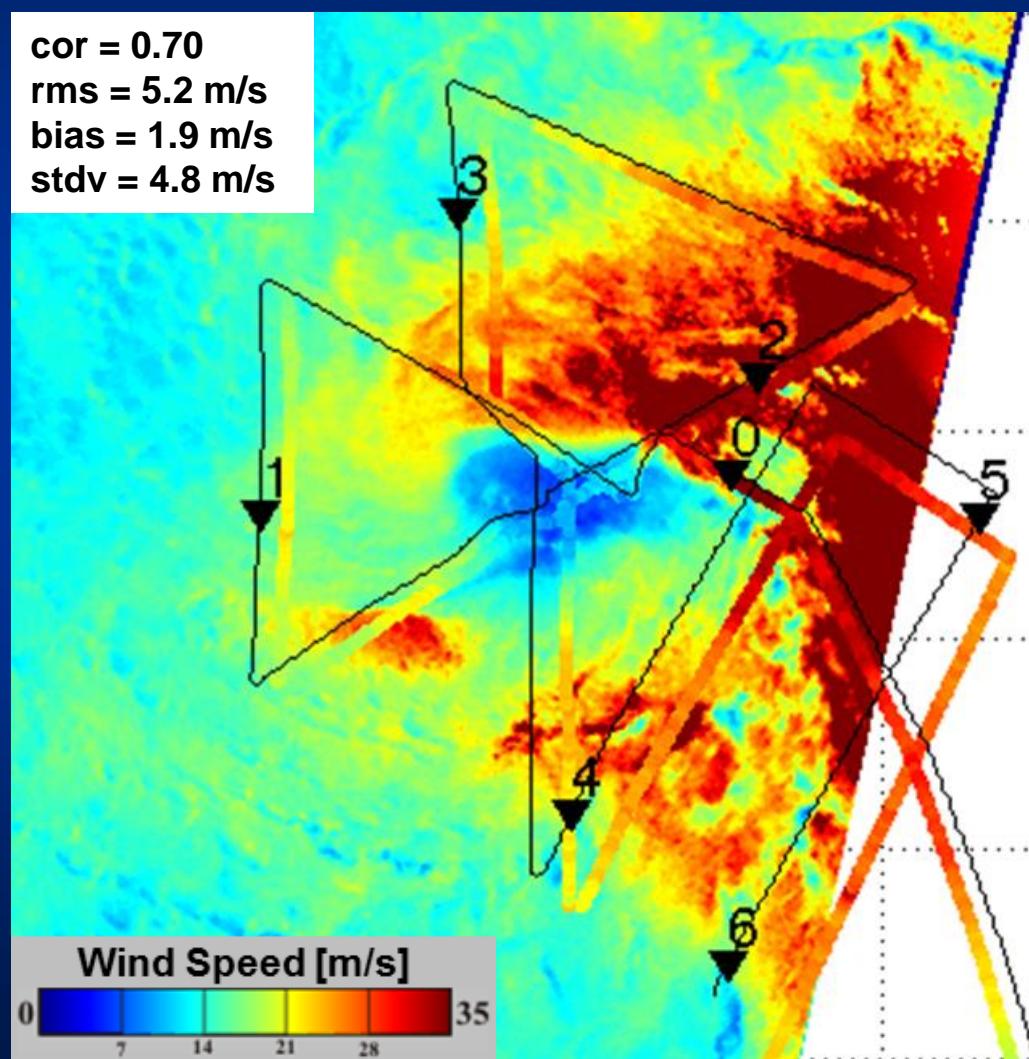
$$\sigma_0^{pol} = a(\theta)u^{\gamma(\theta)}[1 + b(\theta)\cos\phi + c(\theta)\cos(2\phi)]$$



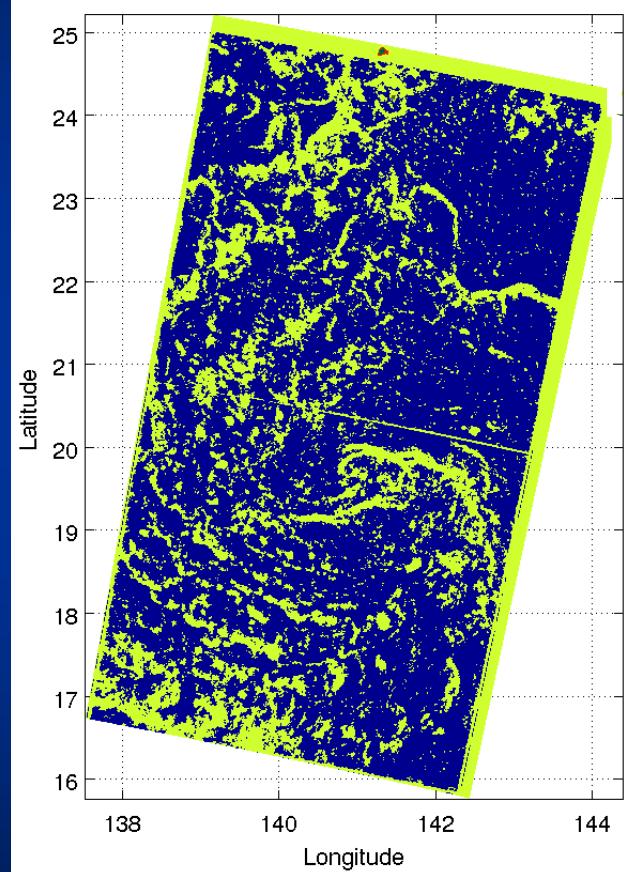
# SAR-Retrieved Winds (co-pol) in Comparison to QSCAT and SFMR



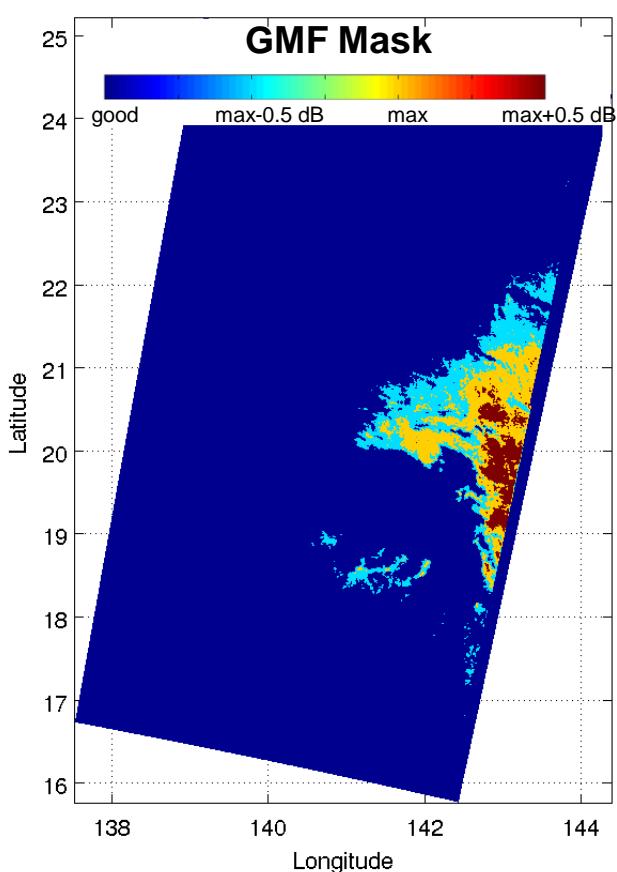
Typhoon 20 Sep. 2010  
Malaksa at 20:29 UTC



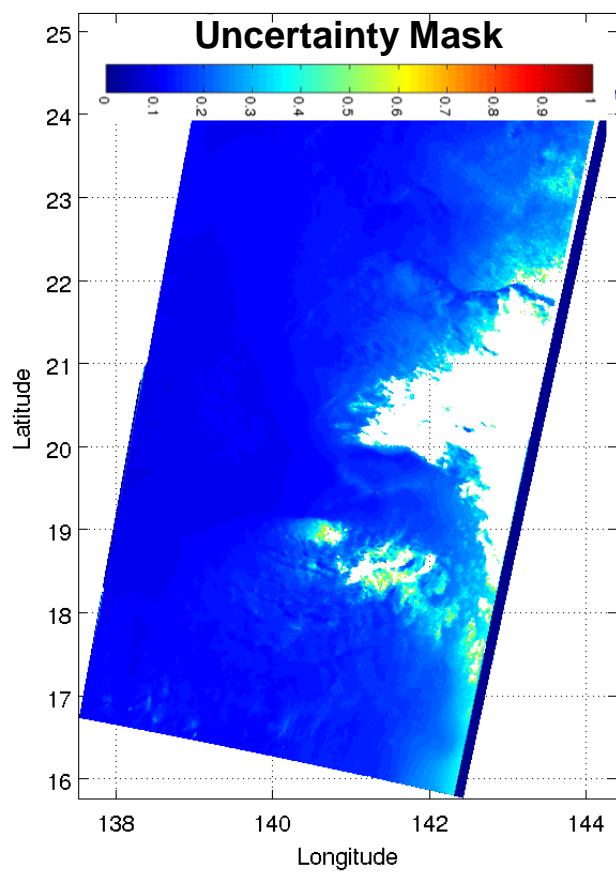
# Estimation of Wind Field Uncertainties and GMF Limitations



SAR wind field



Limitation of GMF  
definition



Wind speed  
uncertainty

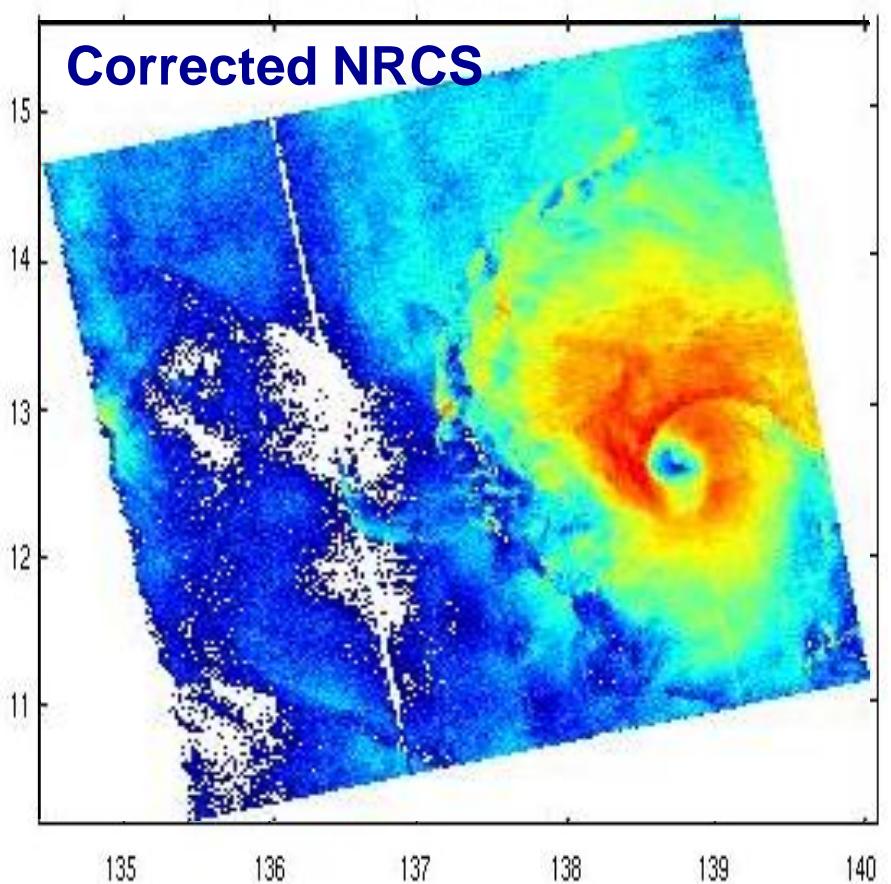
# Noise Correction of Radarsat-2 Cross Pol NRCS

NRCS [dB]

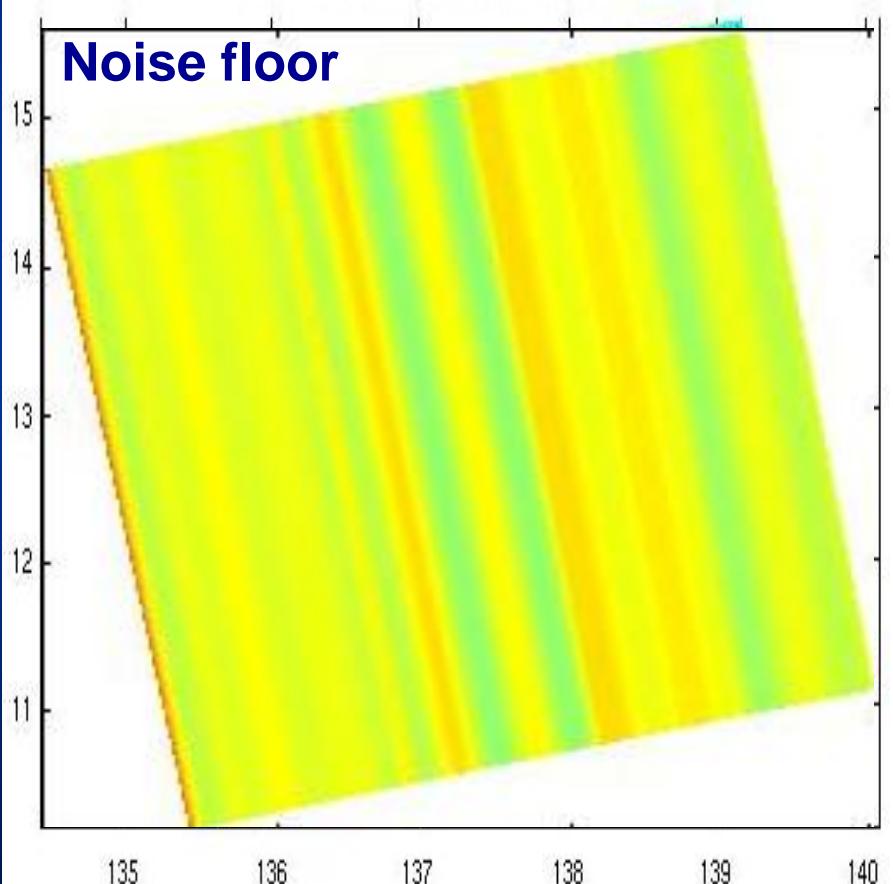
-40 -20

Radarsat-2 HV image of  
Typhoon Megi 17. Sep 2010

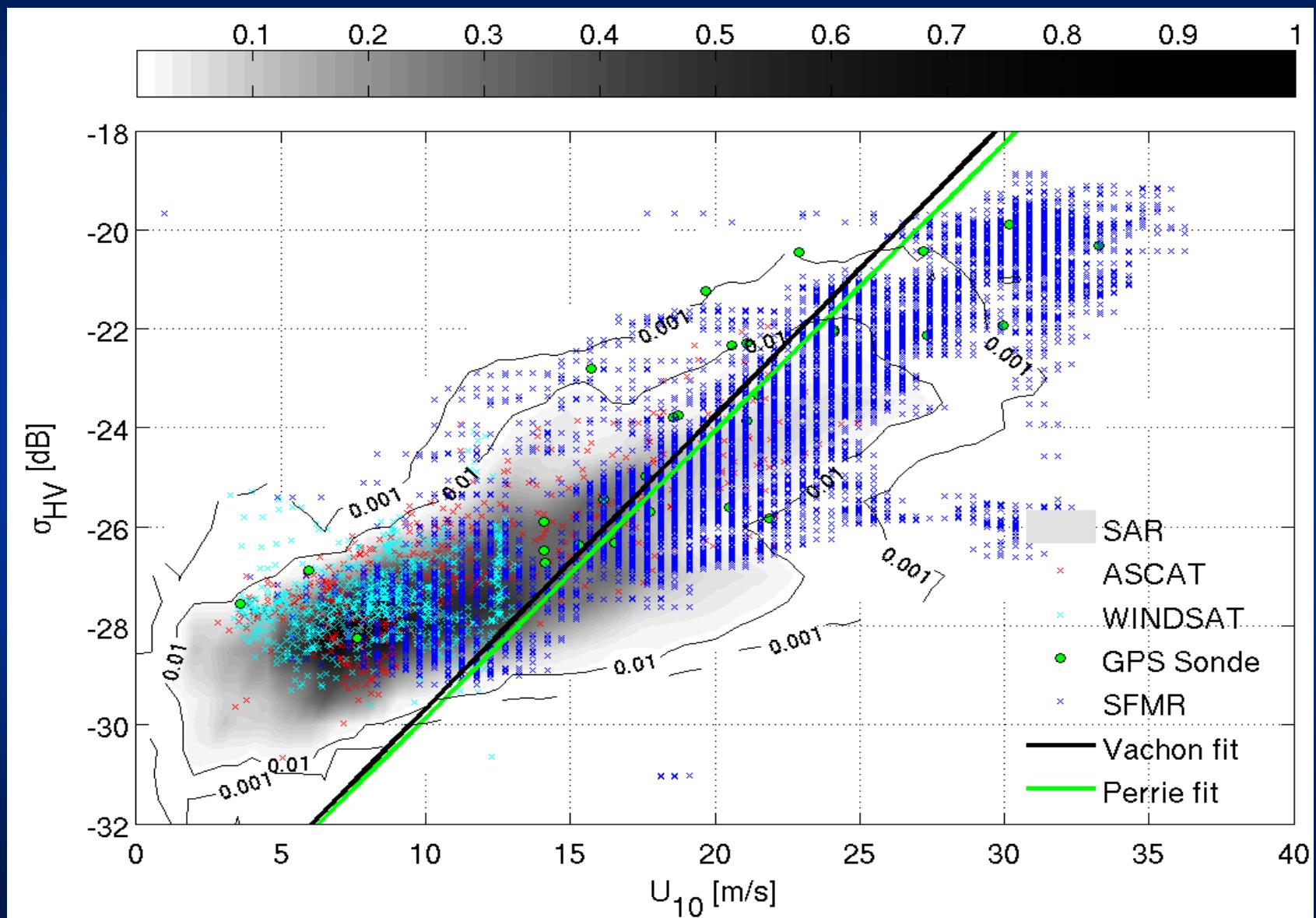
Corrected NRCS



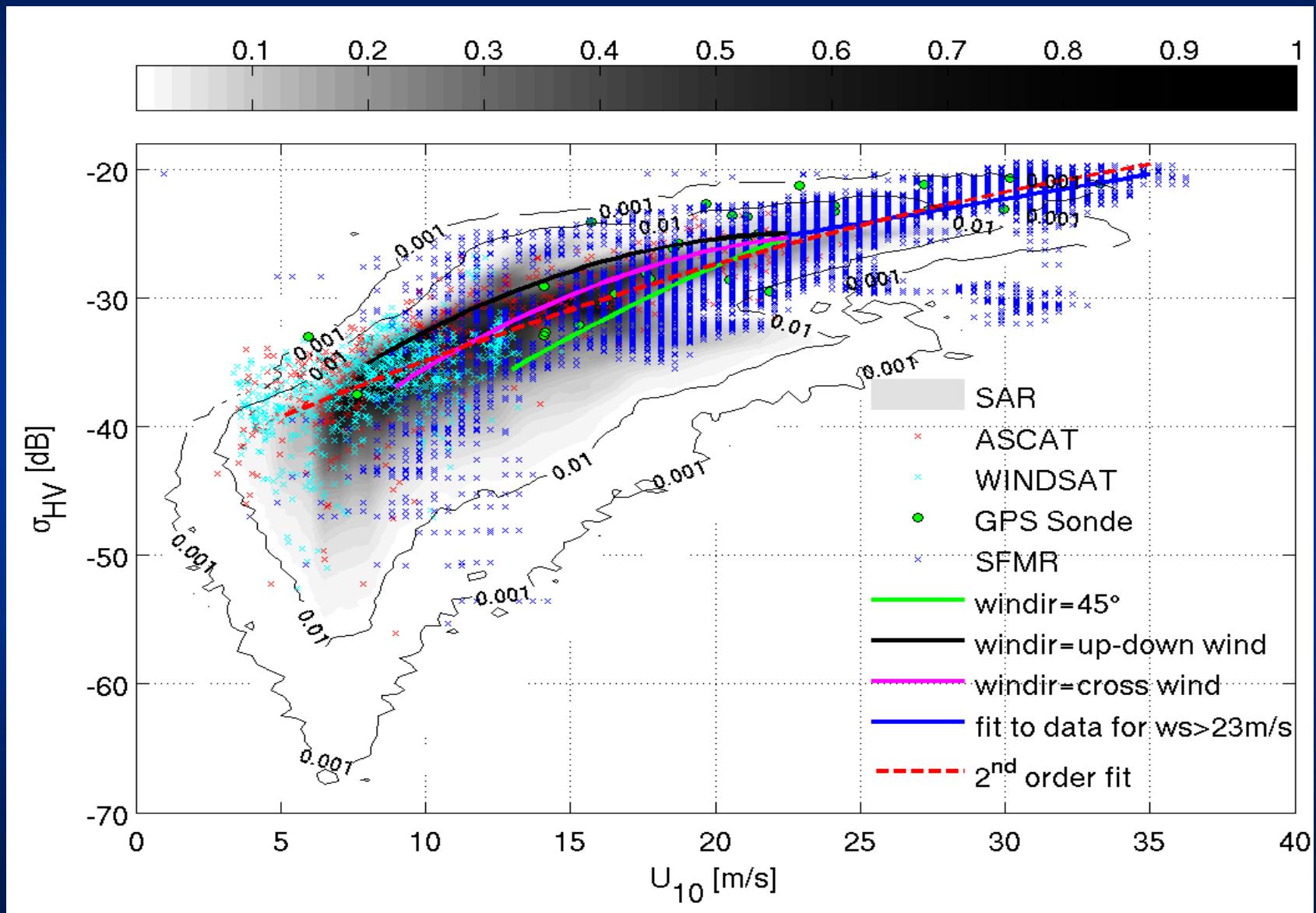
Noise floor



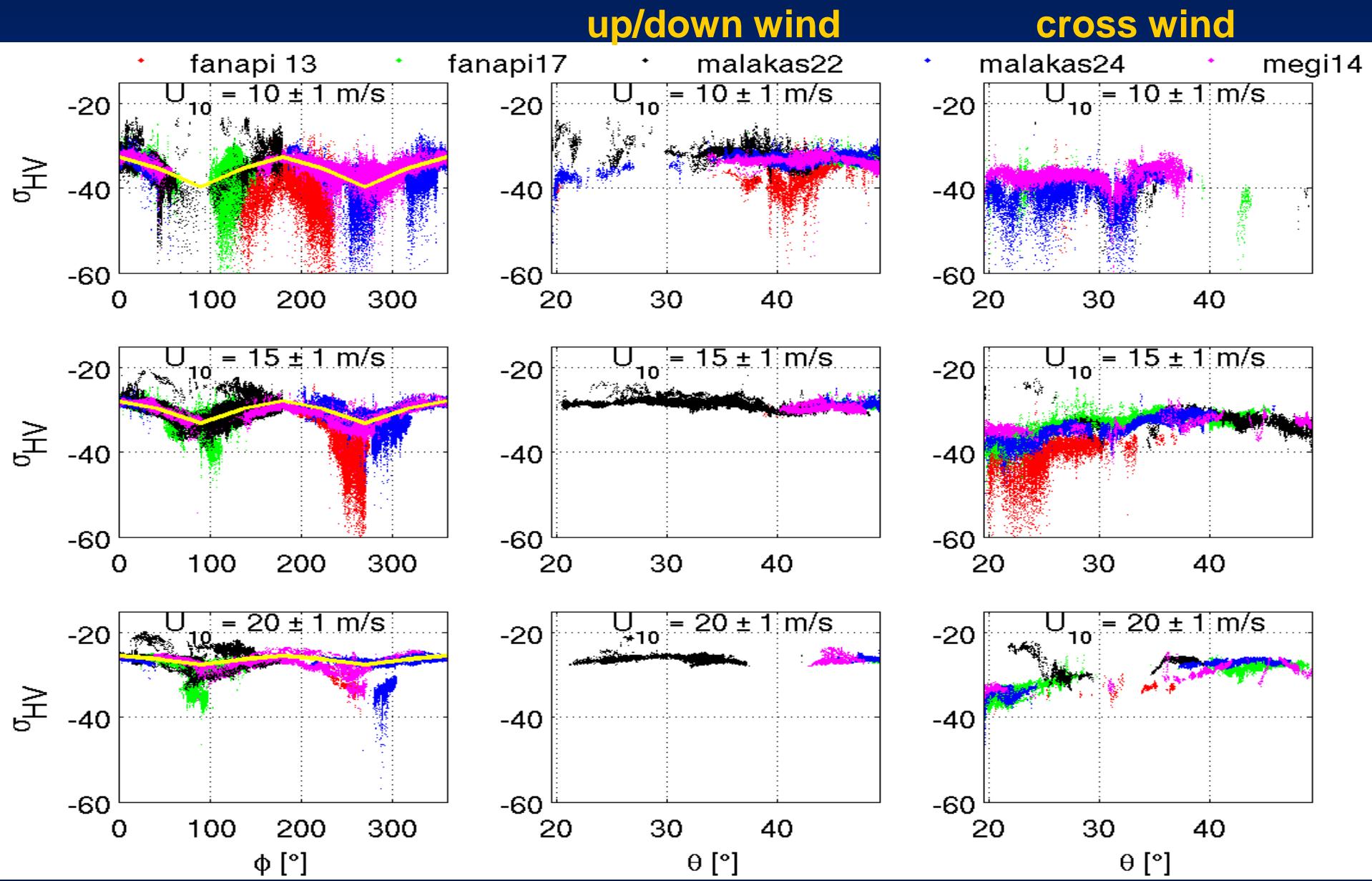
# Dependence of NRCS on Wind Speed (Including Noise Floor)



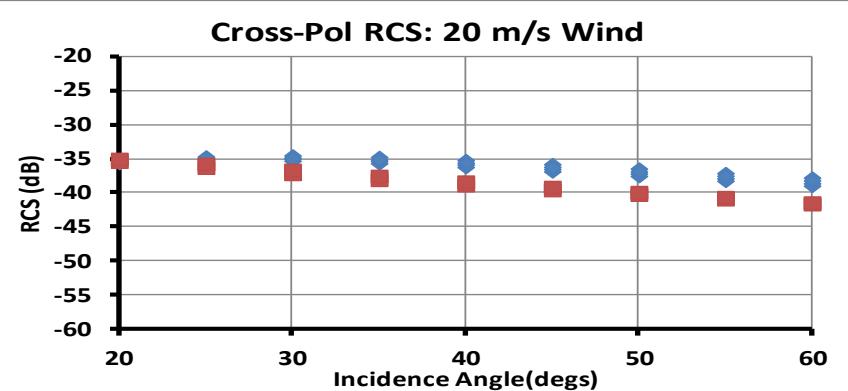
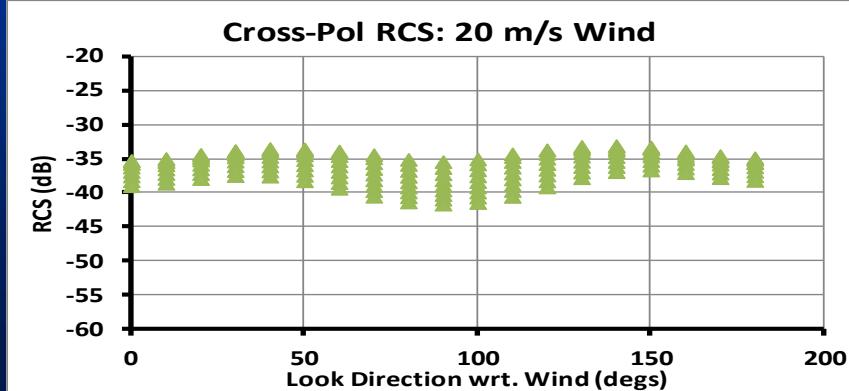
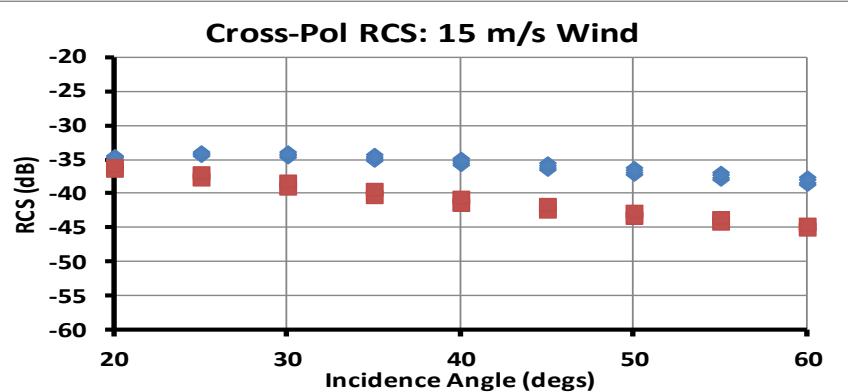
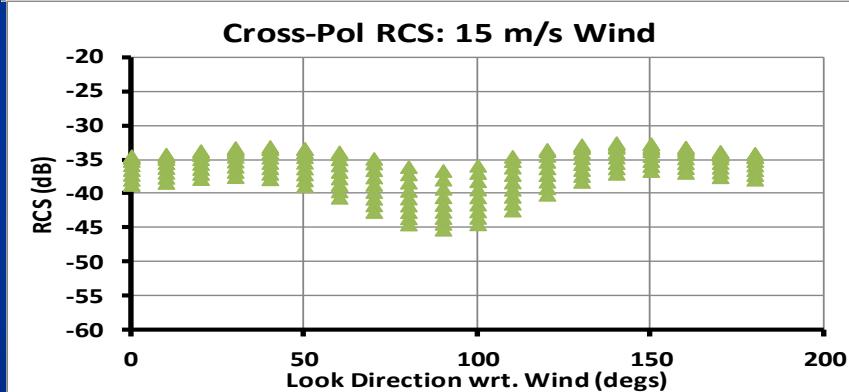
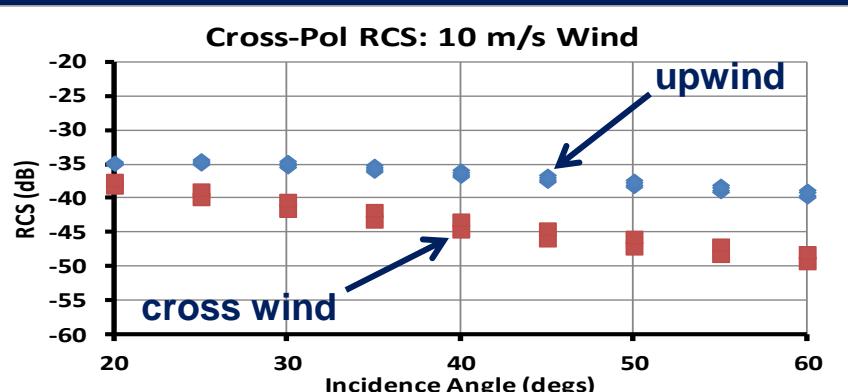
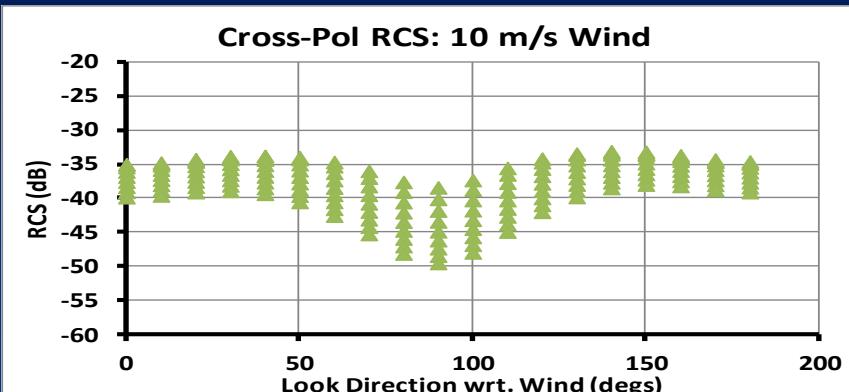
# Dependence of NRCS on Wind Speed (Noise Floor removed)



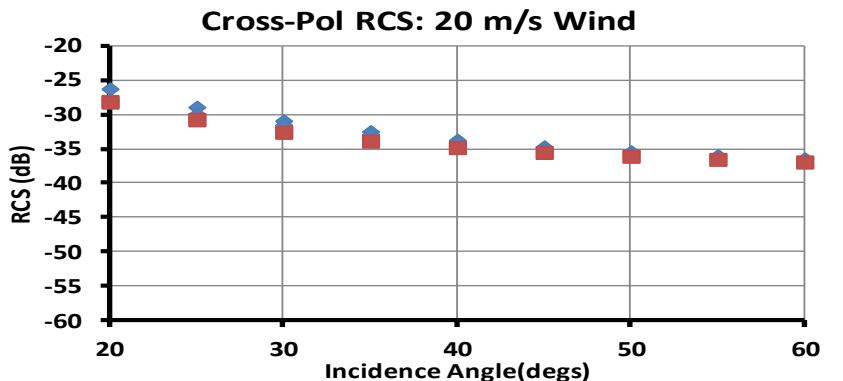
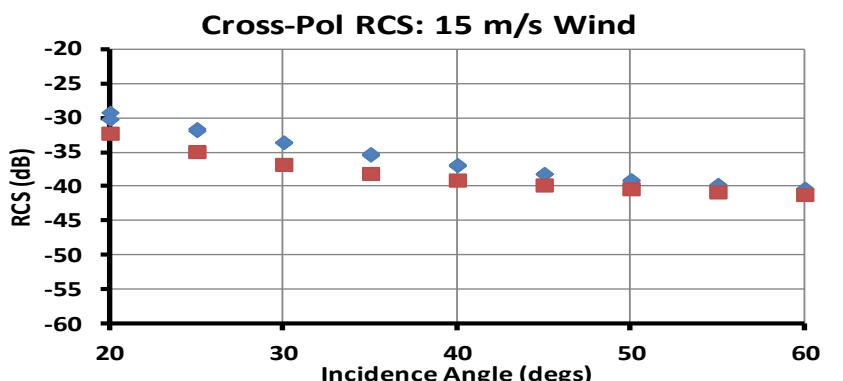
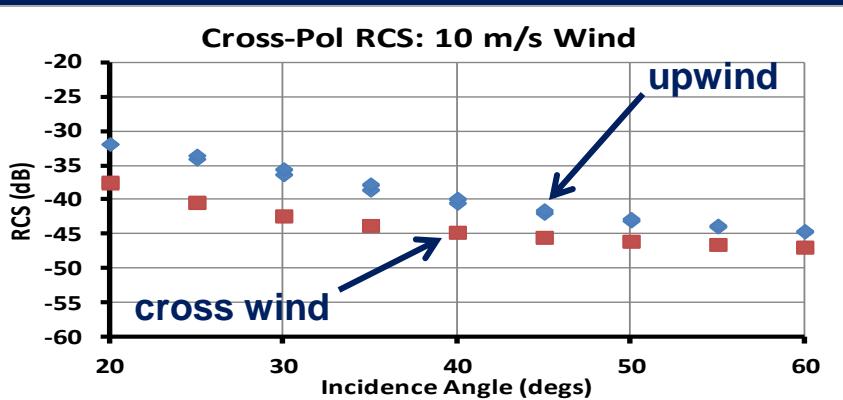
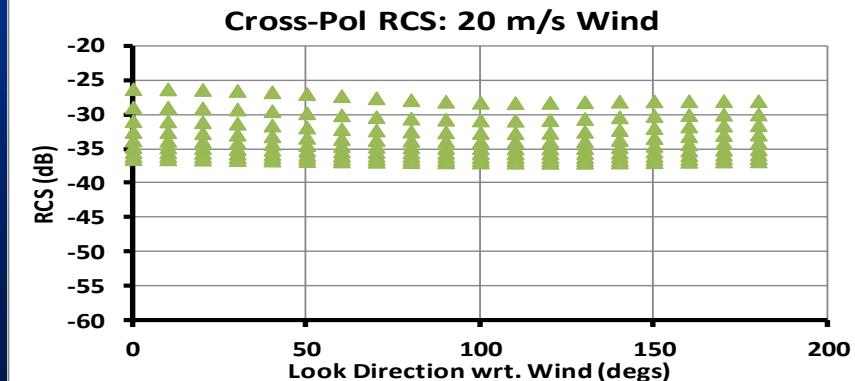
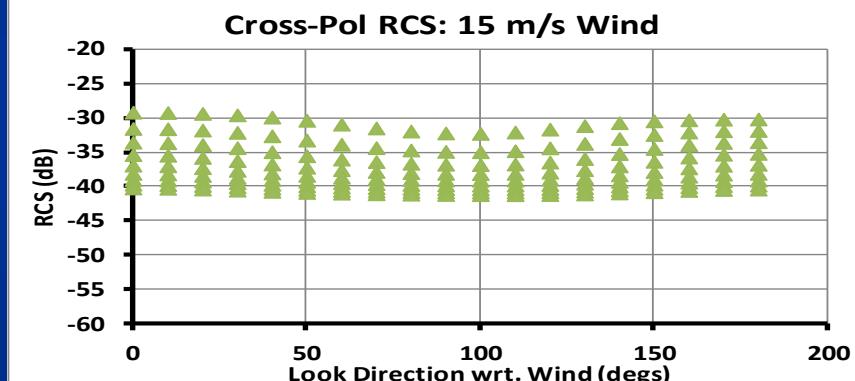
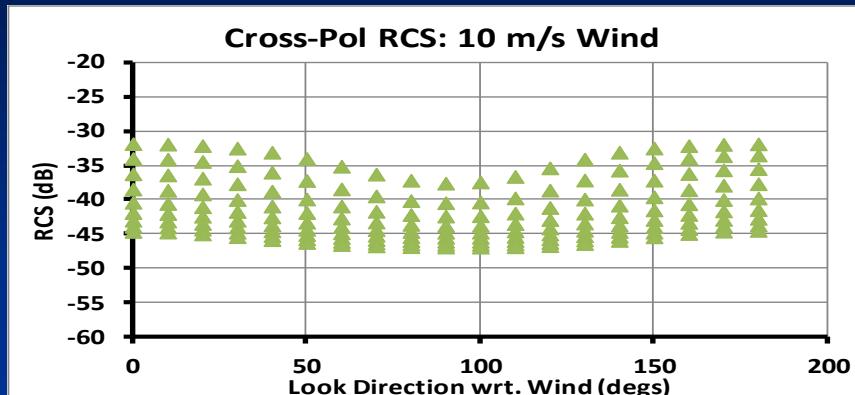
# Additional Dependencies of Cross-pol NRCS



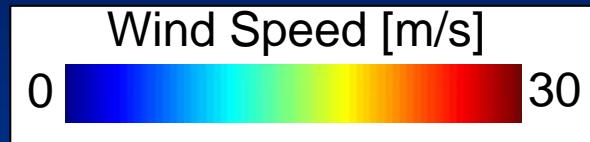
# Modelling of the NRCS Excluding Cross Talk



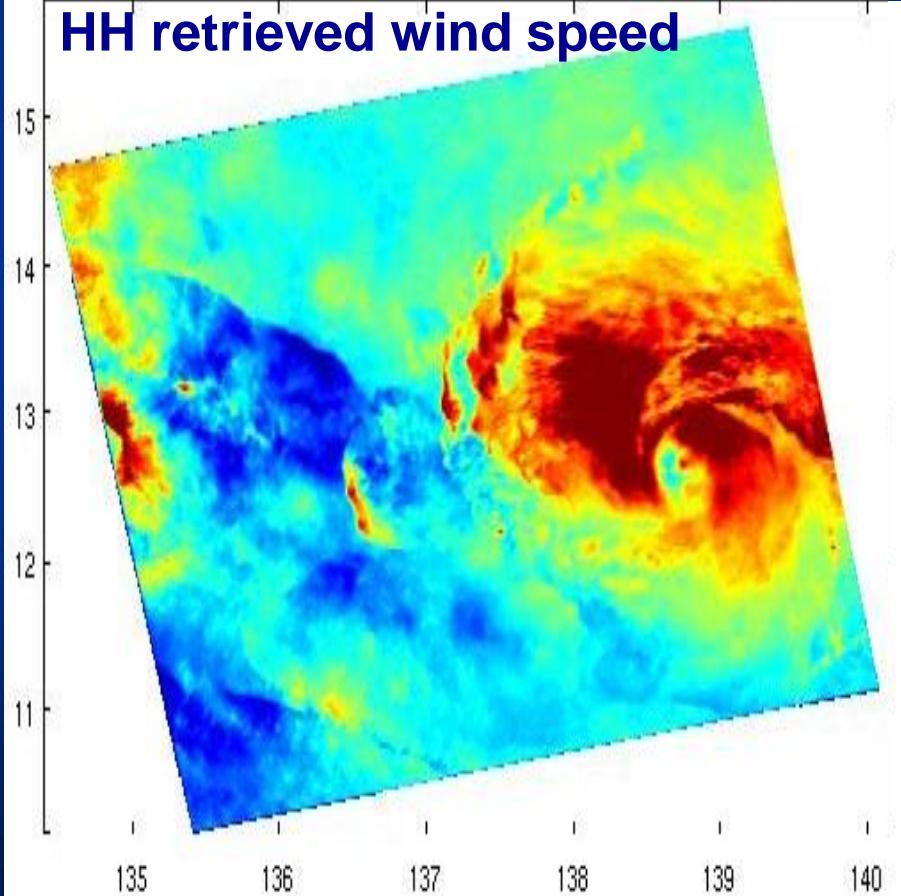
# Modelling of the NRCS Including Cross Talk (-32 dB Isolation )



# Radarsat-2 Crosspol (HV) Retrieved Wind Speeds

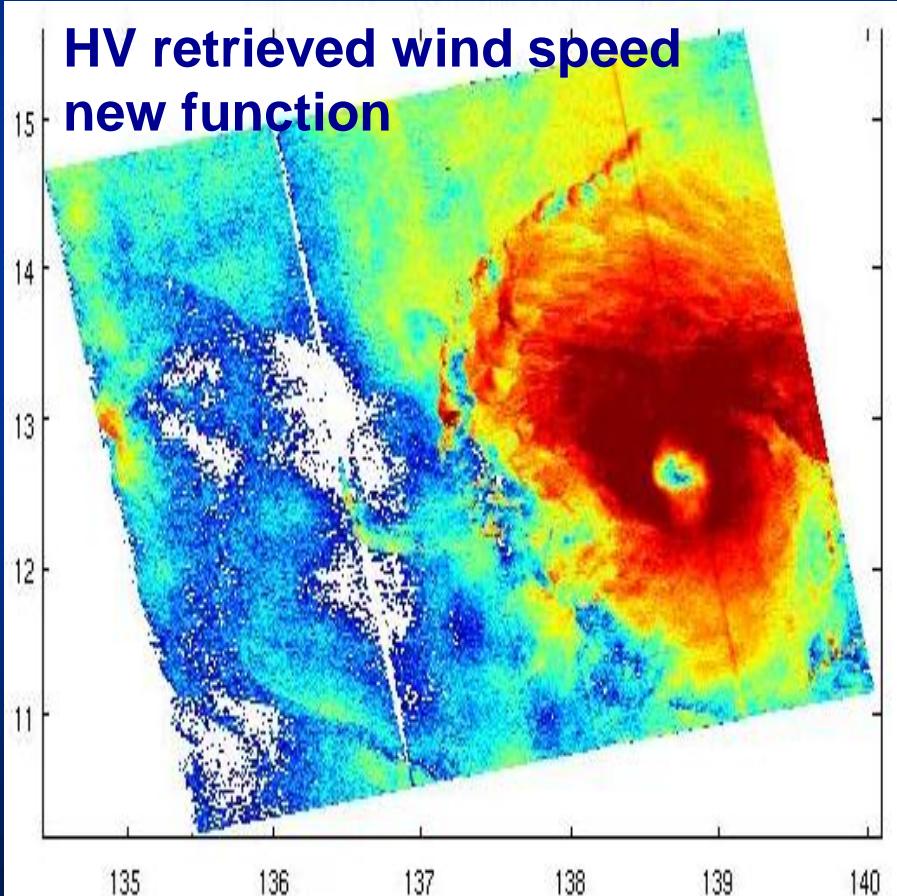


HH retrieved wind speed



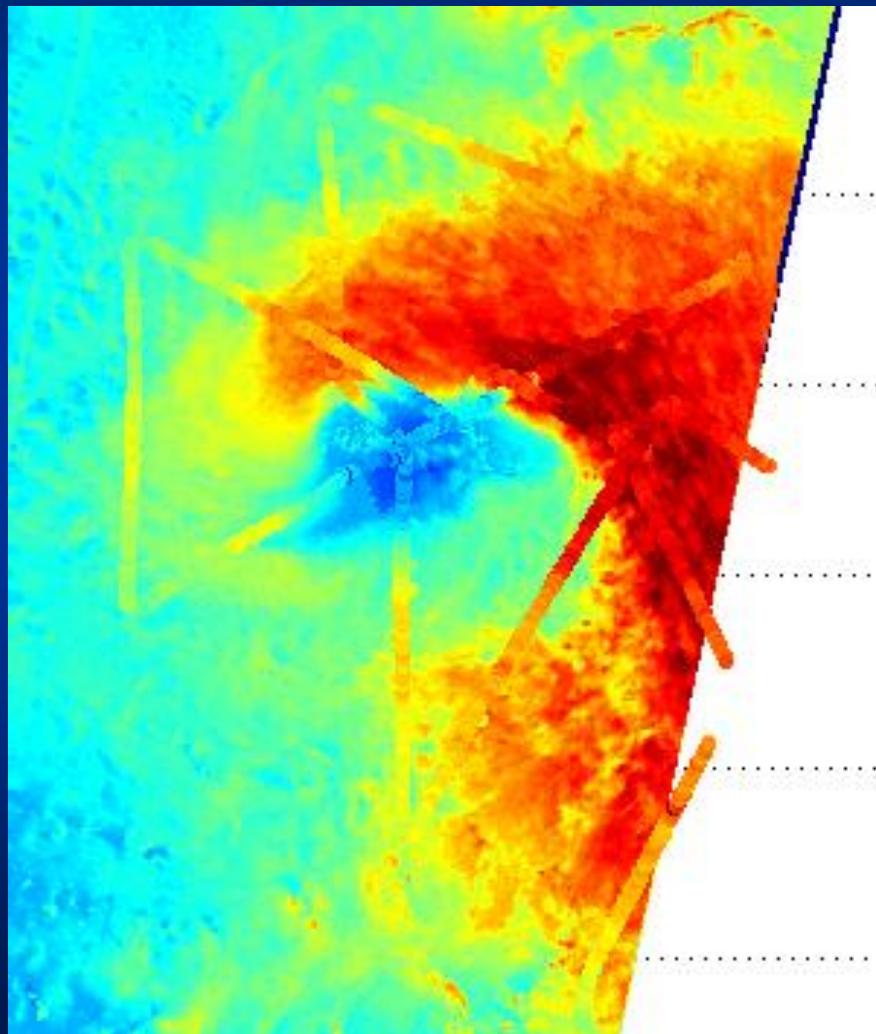
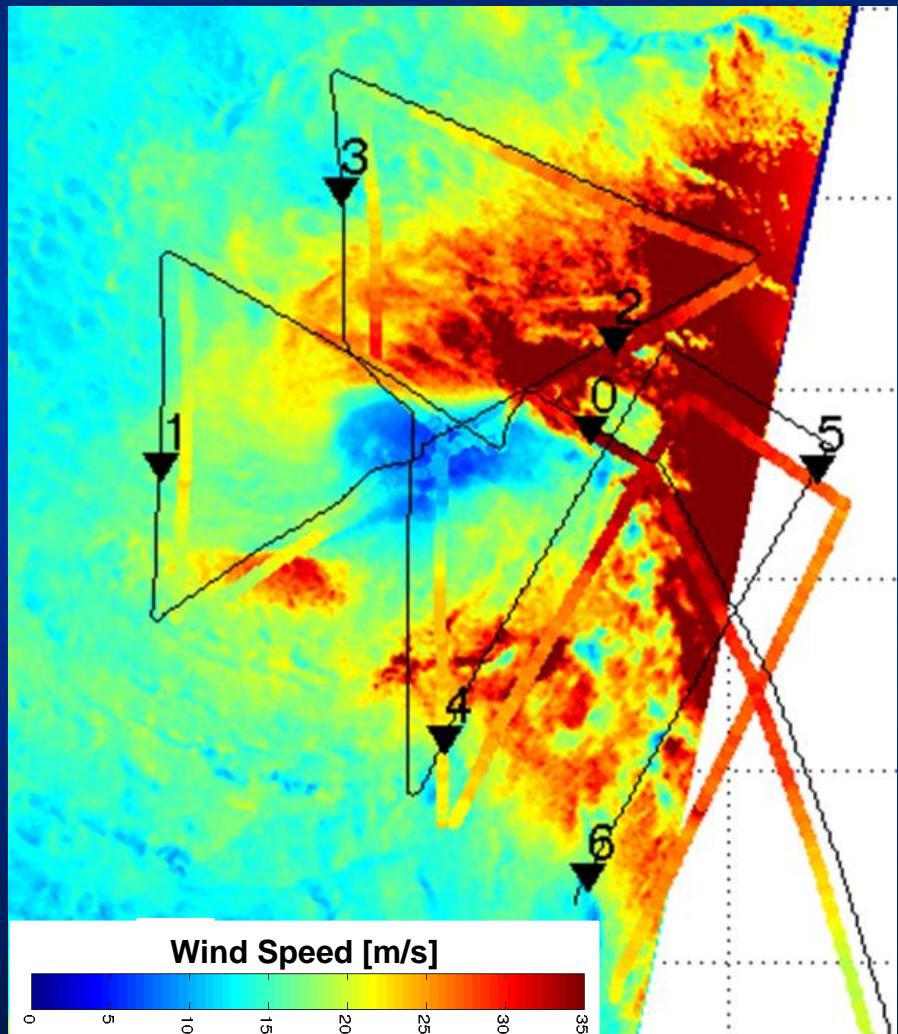
Radarsat-2 HV image of  
Typhoon Megi 17. Sep 2010

HV retrieved wind speed  
new function

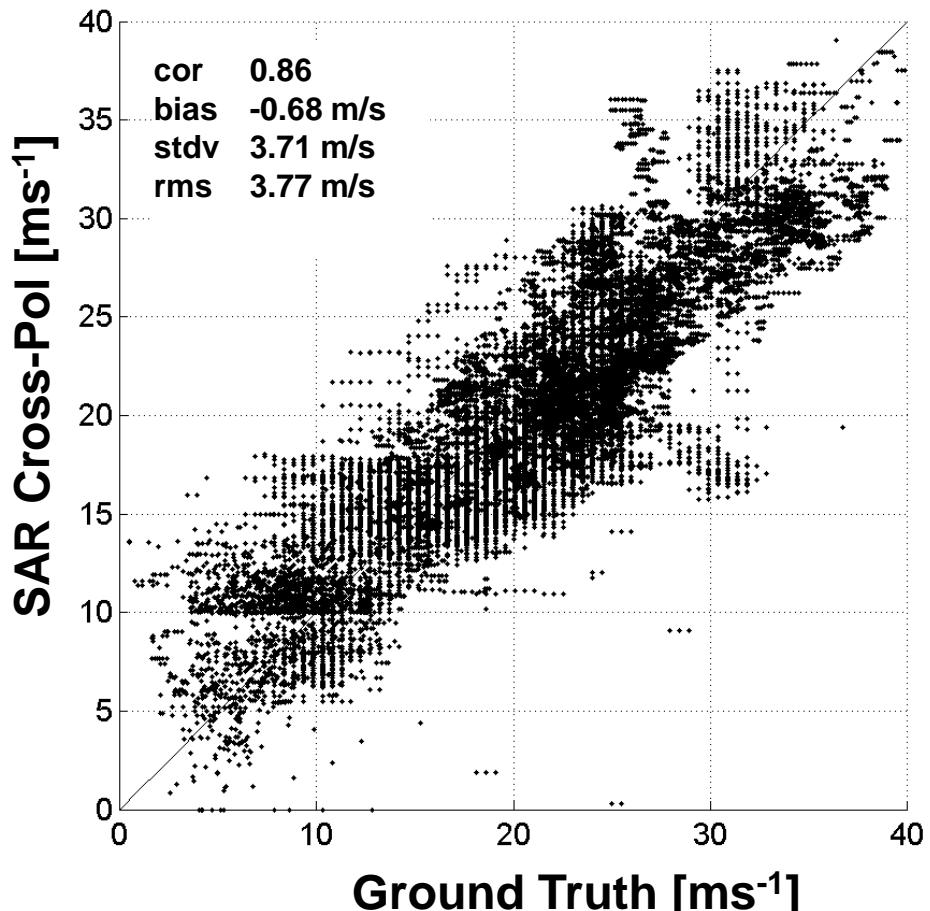
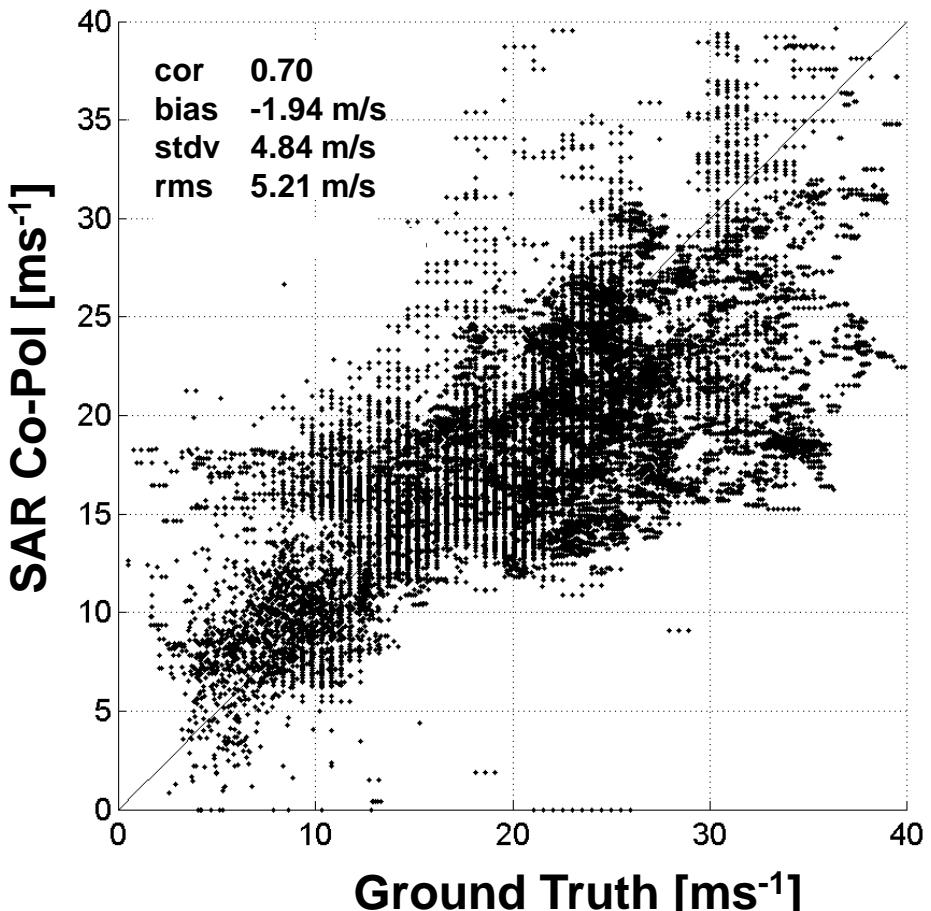


# Comparison of Co- and Cross-pol Retrieved Wind Speeds to SFMR

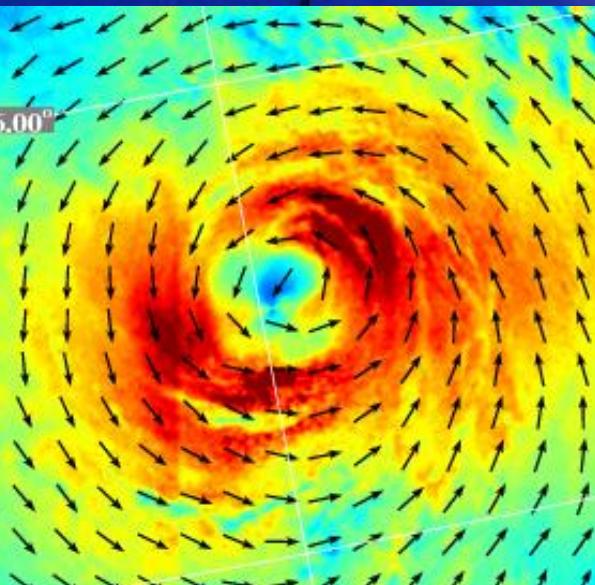
Typhoon 20 Sep. 2010  
Malaksa at 20:29 UTC



# Validation of Co-pol and Cross-pol GMF with SFMR and Dropsondes



# Summary & Outlook



**SAR wind directions from orientation of linear features (rms of 18°, lack of inflow)**

**Filters have been developed to flag:**

- non wind induced areas
- areas with uncertain wind speeds

**C-band cross pol GMF developed  
(significatl improvement in high wind speeds >25 m/s)**

**Further investigation of cross pol with respect to wind direction and incidence angle**

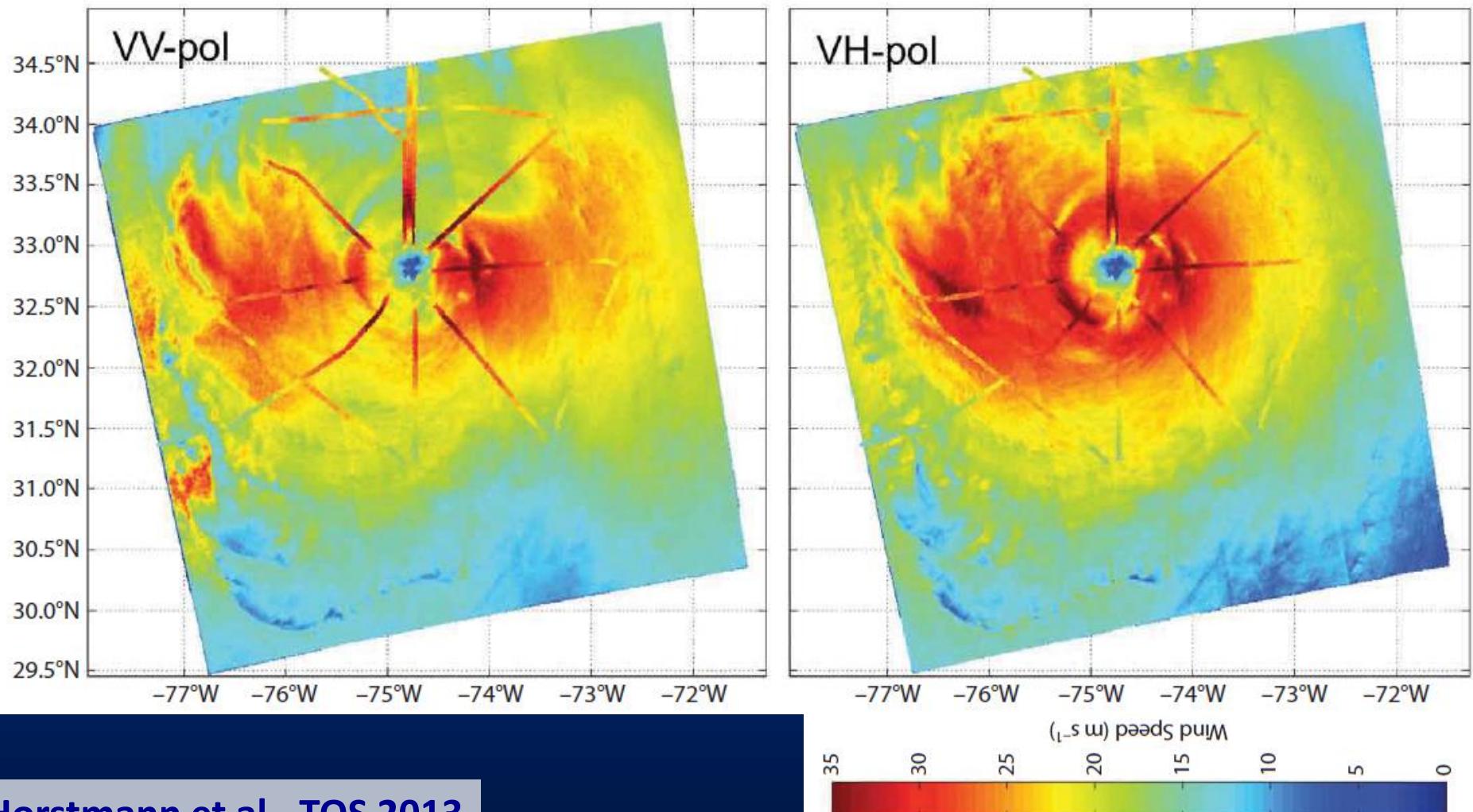
**Merging of co-pol and cross pol retrieved winds**

**What about rain under cross pol?**

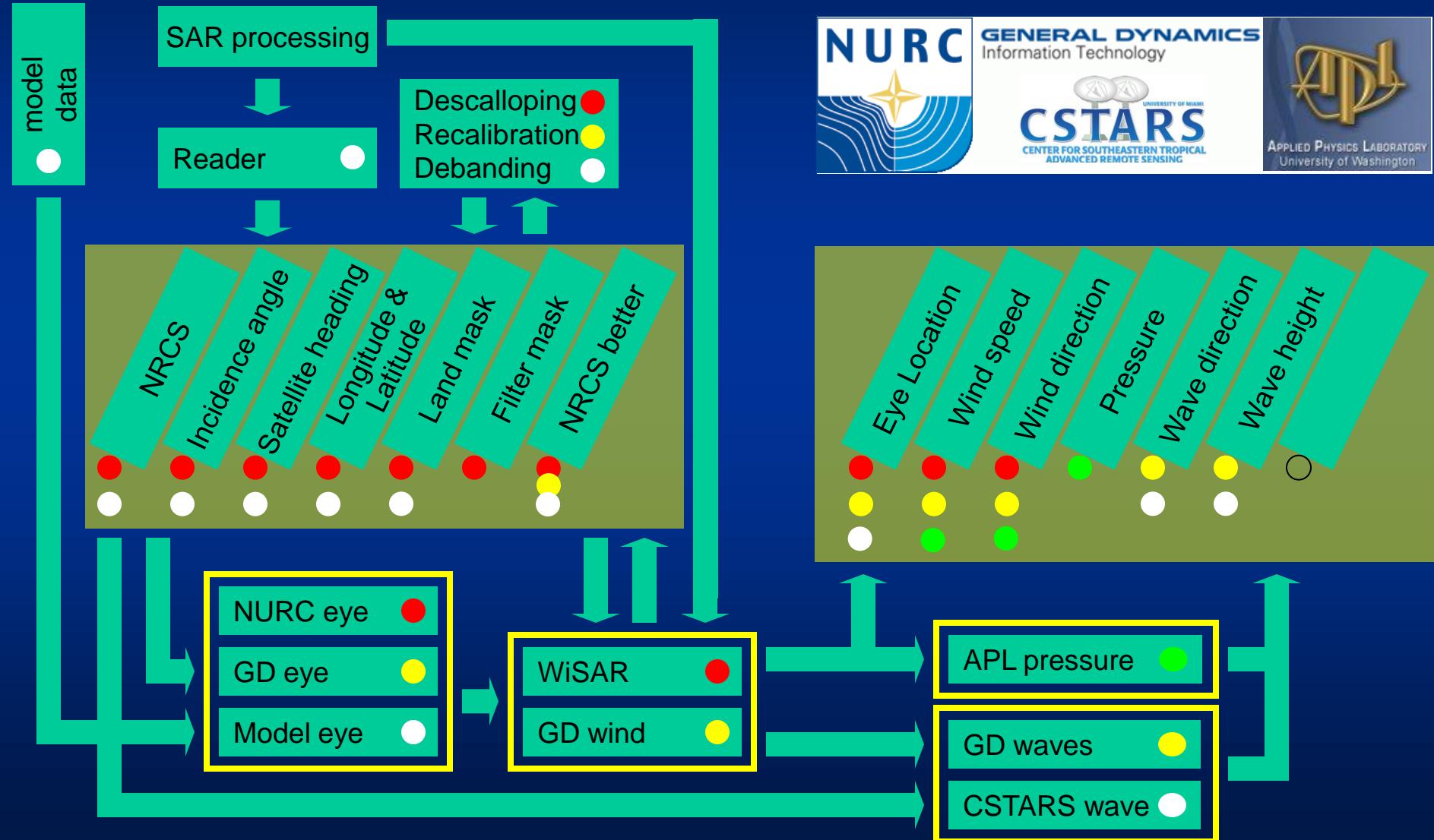


# Comparison of Co- and Cross-pol Retrieved Wind Speeds to SFMR

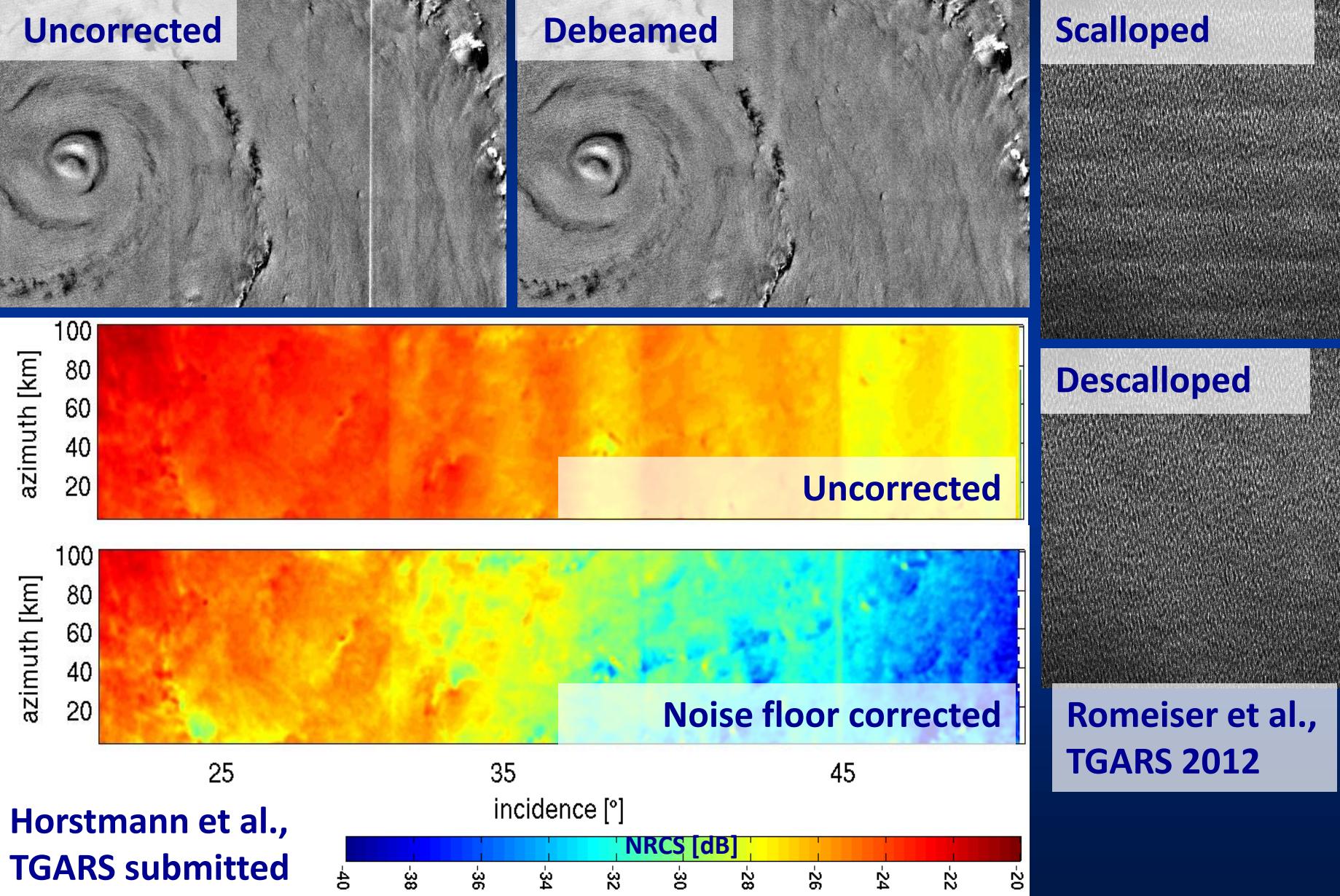
Hurricane Earl 2 Sep. 2010  
at 22:59 UTC



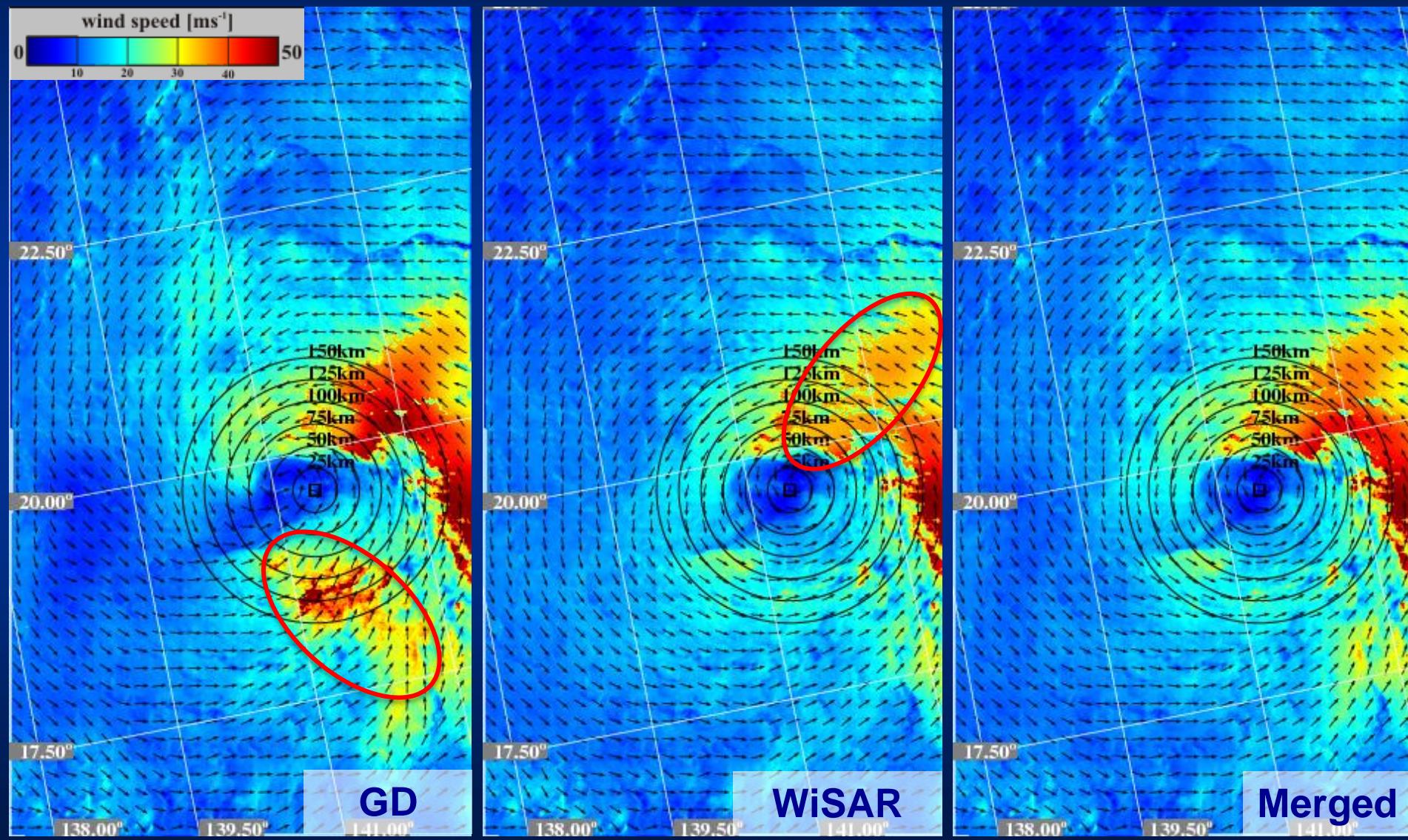
# SAR Typhoon Processing System



# Automated Removal of Sensor Artifacts and Careful Calibration

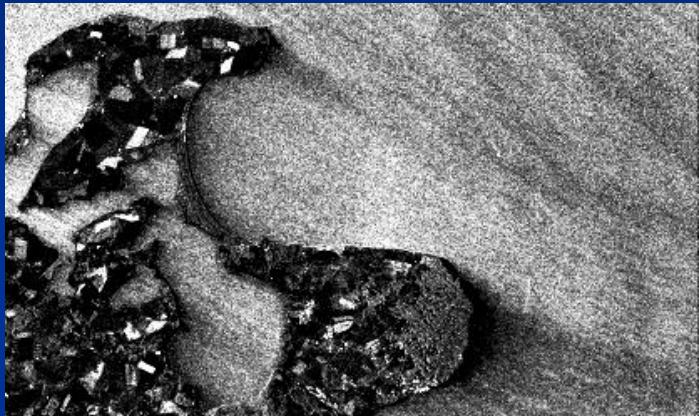


# Merging Wind Directions from GD with WiSAR

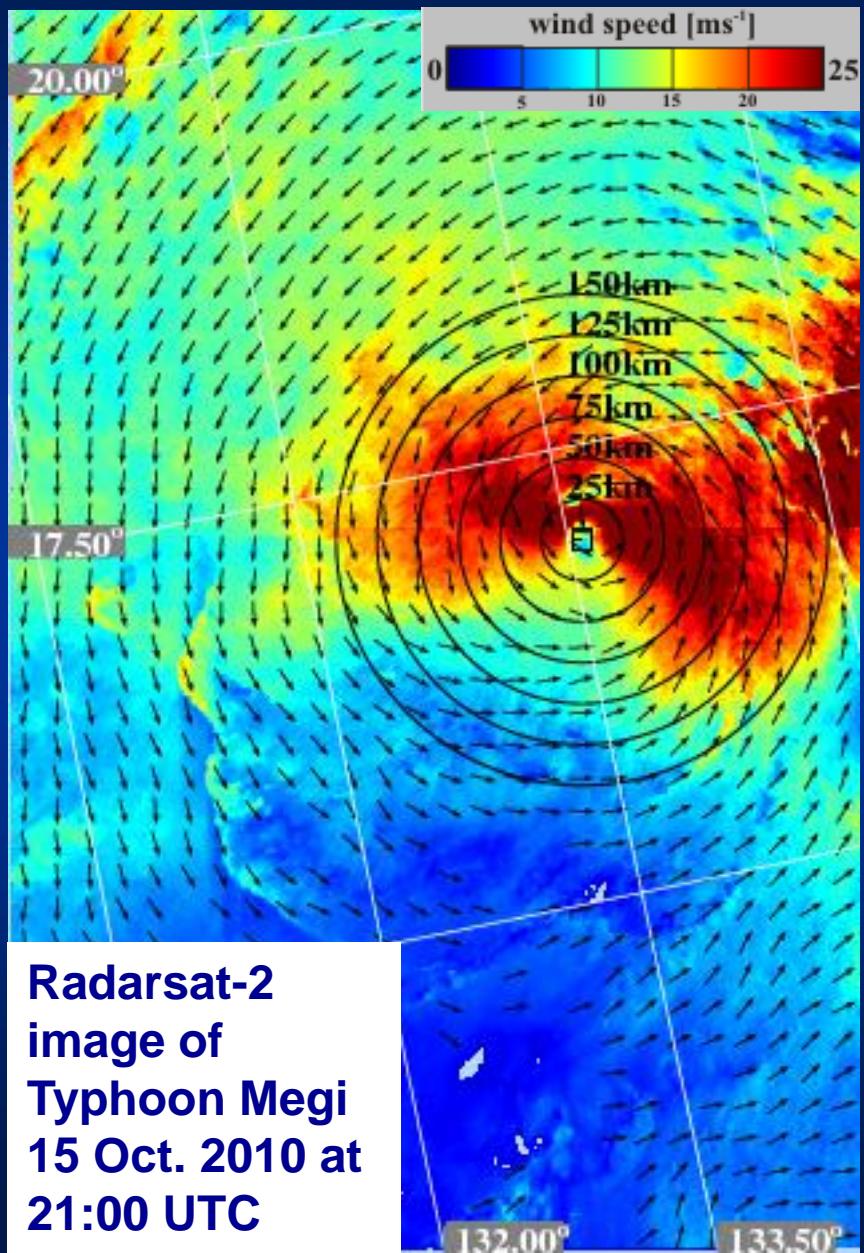
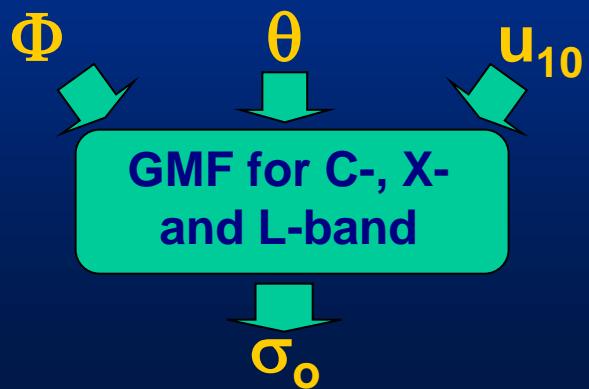


# General Approach for Ocean SAR Wind Field Retrieval (WiSAR)

## Geophysical Model Function

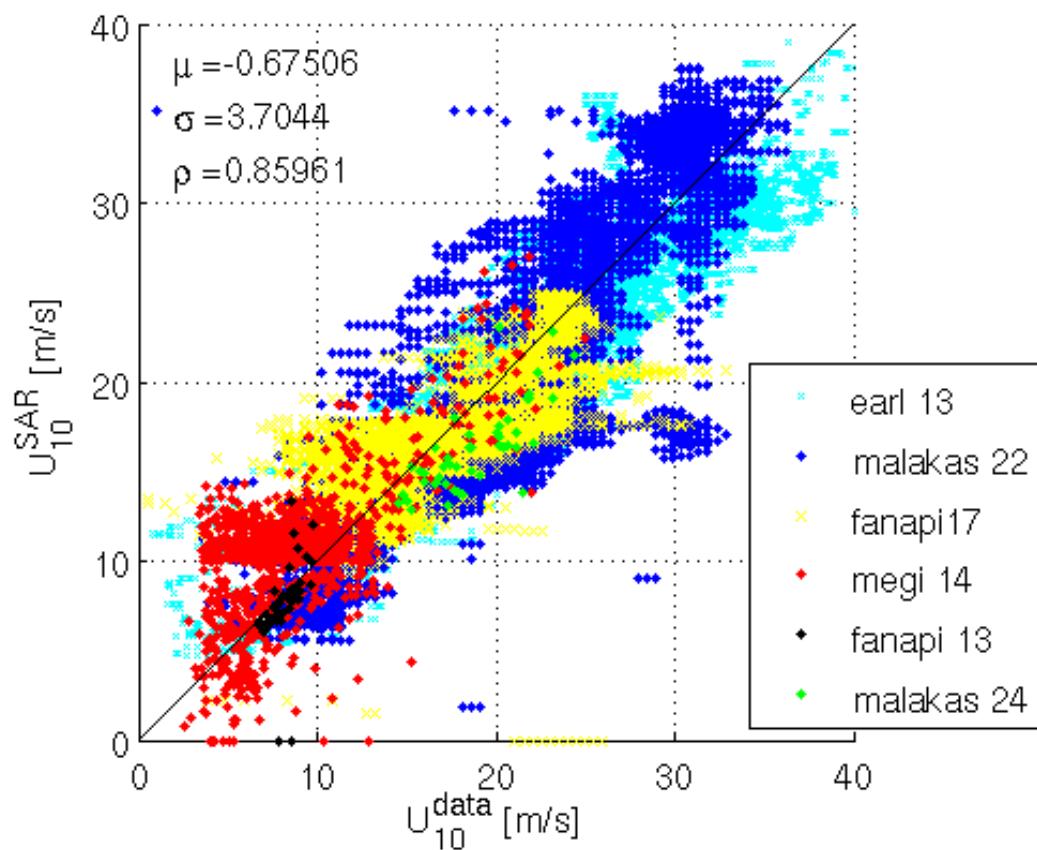


$$\sigma_0^{pol} = a(\theta)u^{\gamma(\theta)}[1 + b(\theta)\cos\phi + c(\theta)\cos(2\phi)]$$



Radarsat-2  
image of  
Typhoon Megi  
15 Oct. 2010 at  
21:00 UTC

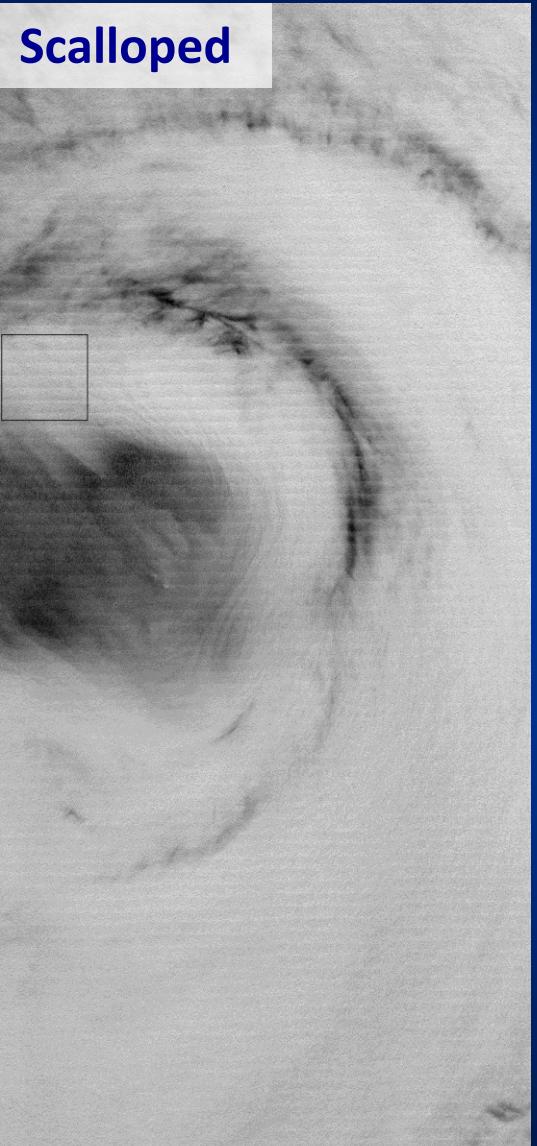
# Comparison of Co- and Cross-pol Retrieved Wind Speeds to SFMR



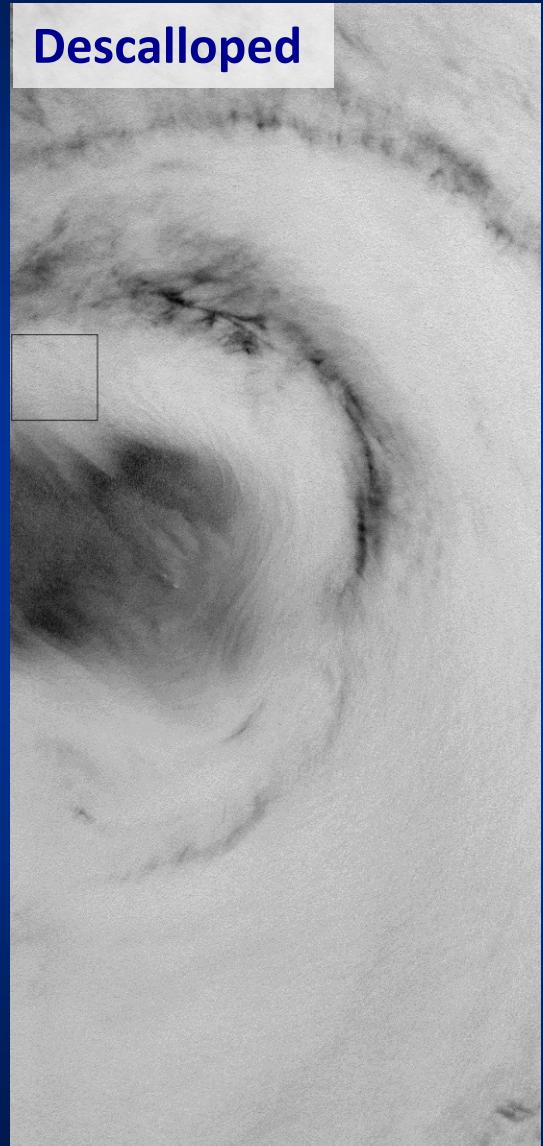
GMF	Bias [m]	Standard Deviation [m]	Correlation
Co pol GMF	0.4	6.42	0.75
HV GMF	0.11	3.75	0.83
HV GMF wind direction dependent	-0.69	3.79	0.85
VH GMF	-1.48	3.22	0.8

# Removal of SAR artifacts e.g. Scalloping

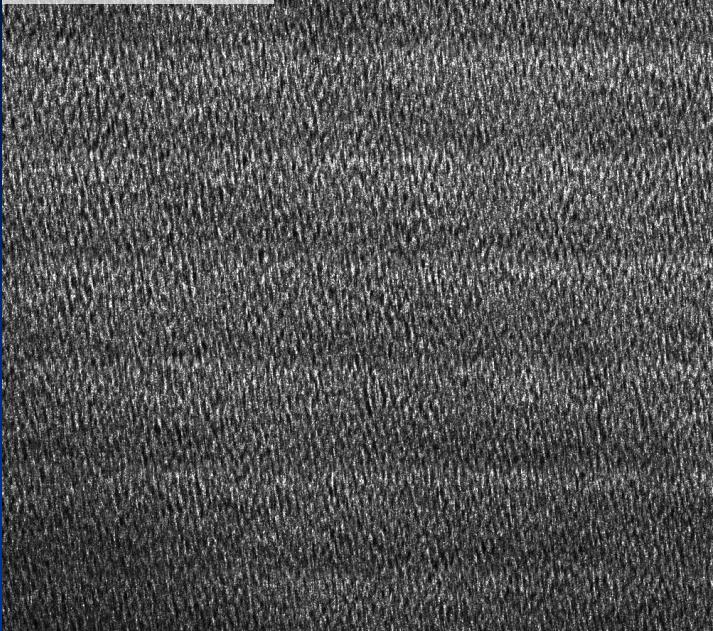
Scalloped



Descalloped



Scalloped

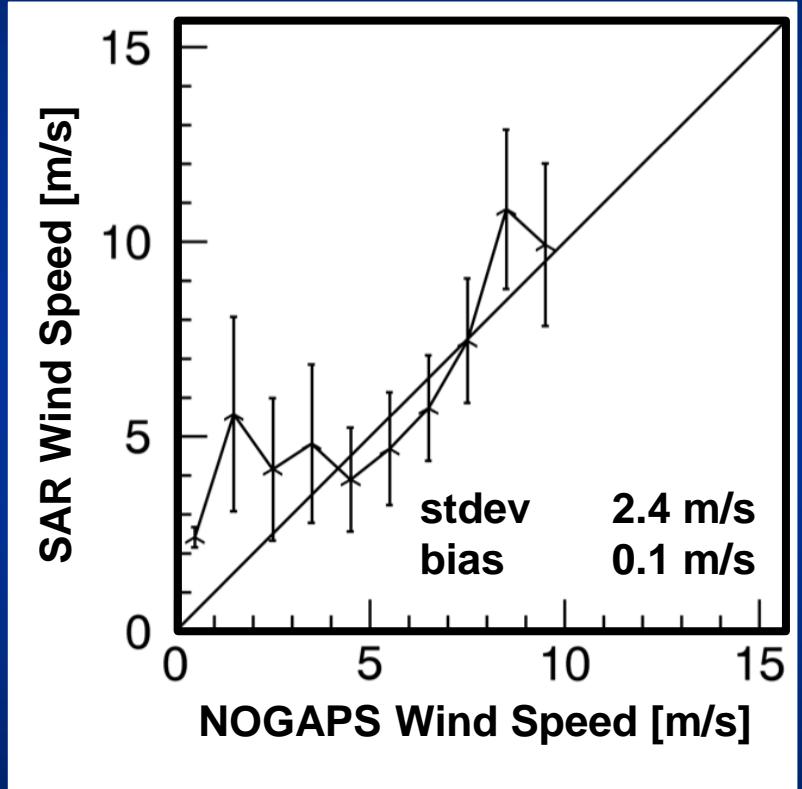


Descalloped



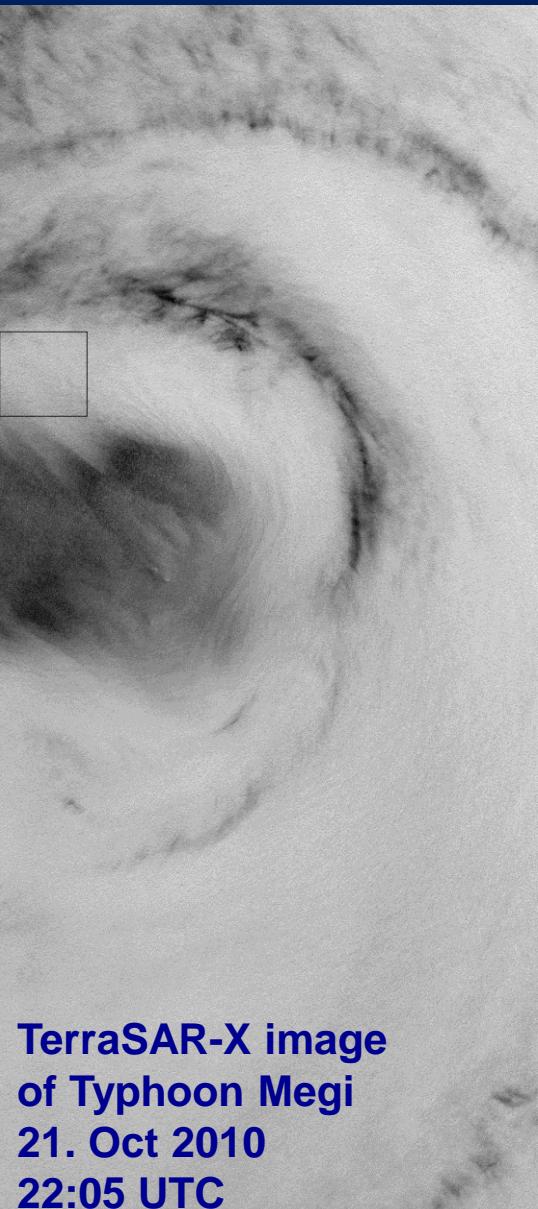
# Development of X-band GMF for Wind Speed Retrieval

## Validation for Moderate Winds

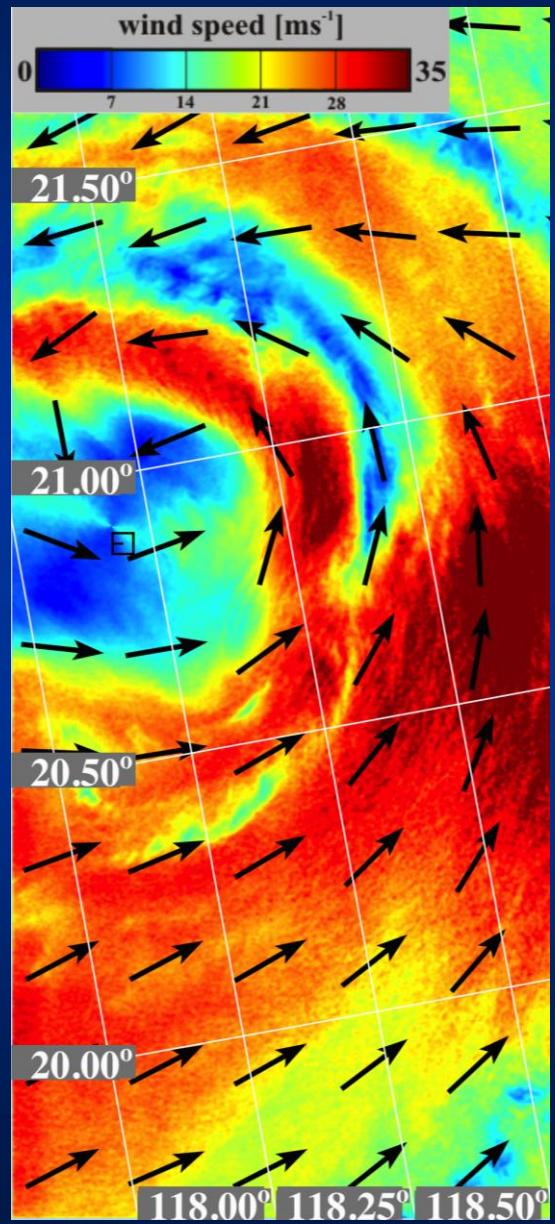


36 Cosmo-SkyMed imagery  
25 km grid (782 co-locations)

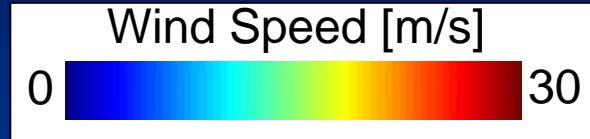
Thompson et al., JGR 2012



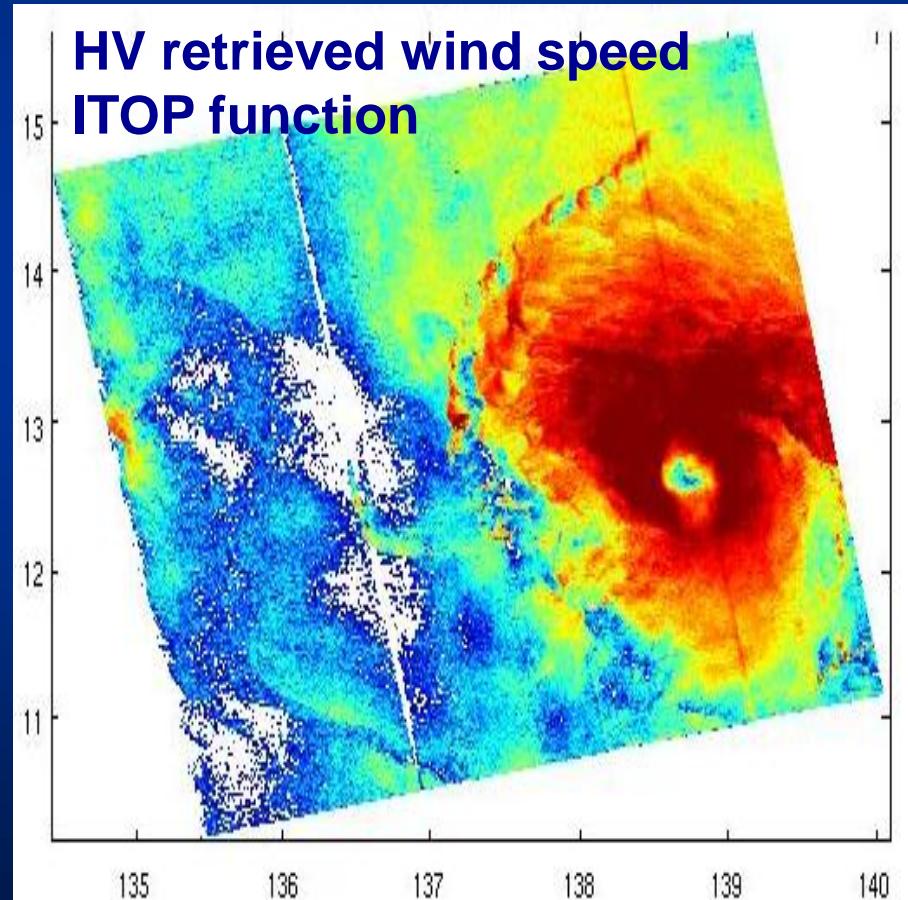
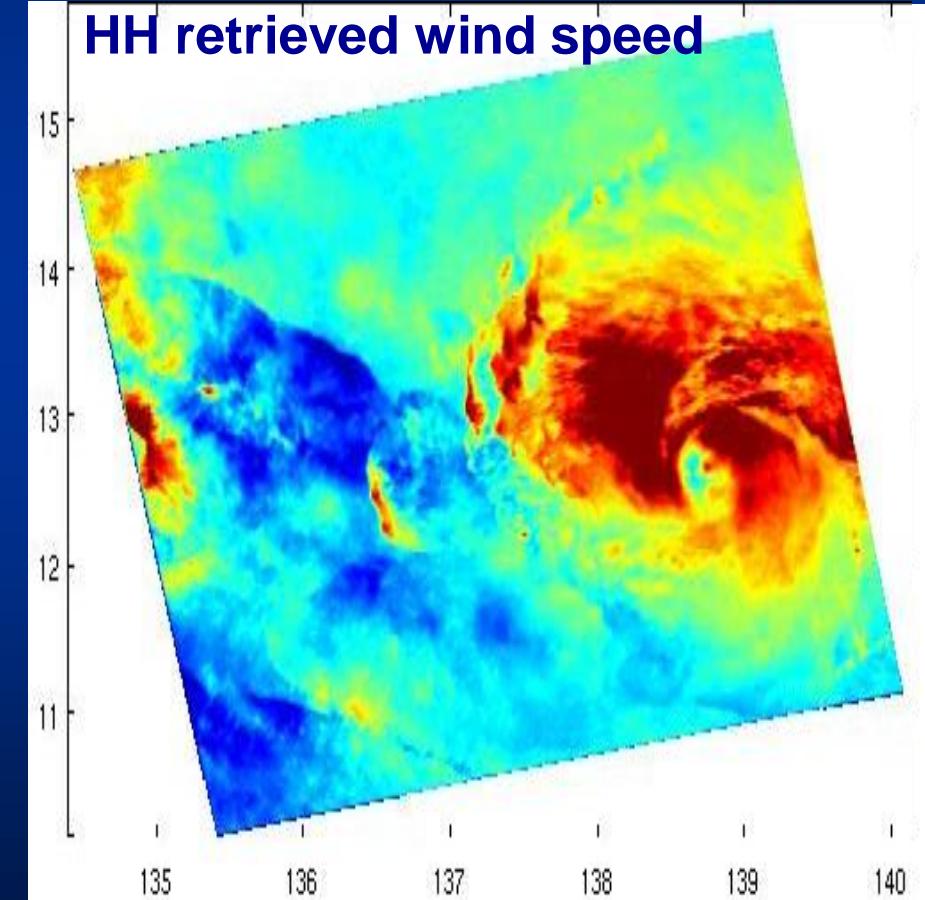
TerraSAR-X image  
of Typhoon Megi  
21. Oct 2010  
22:05 UTC



# Development of Cross-pol GMF Fit to SAR Co-pol Winds



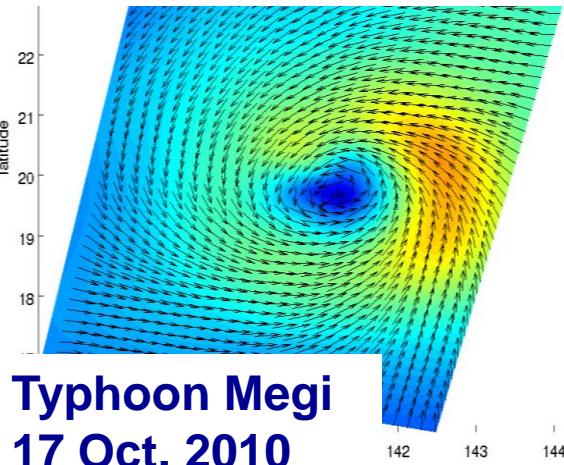
Radarsat-2 HV image of  
Typhoon Megi 17. Sep 2010



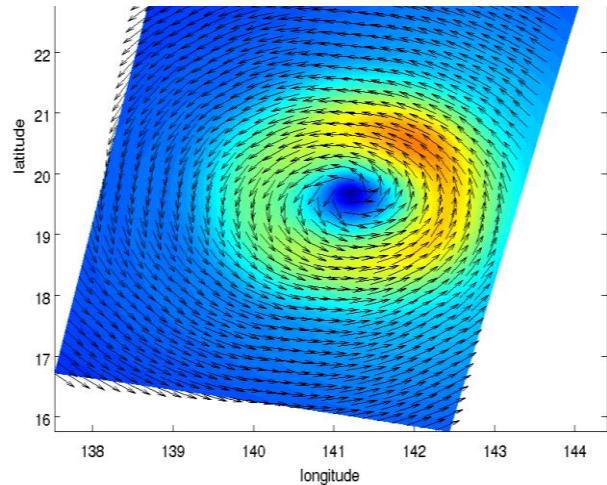
# Ongoing and Outlook

## Ingestion of SAR wind fields into HWIND

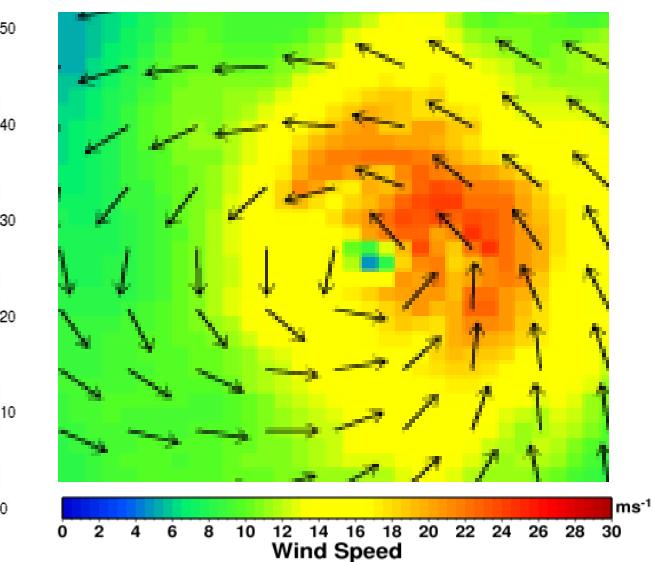
HWIND with  
in situ and SFMR



HWIND solely with  
SAR wind field

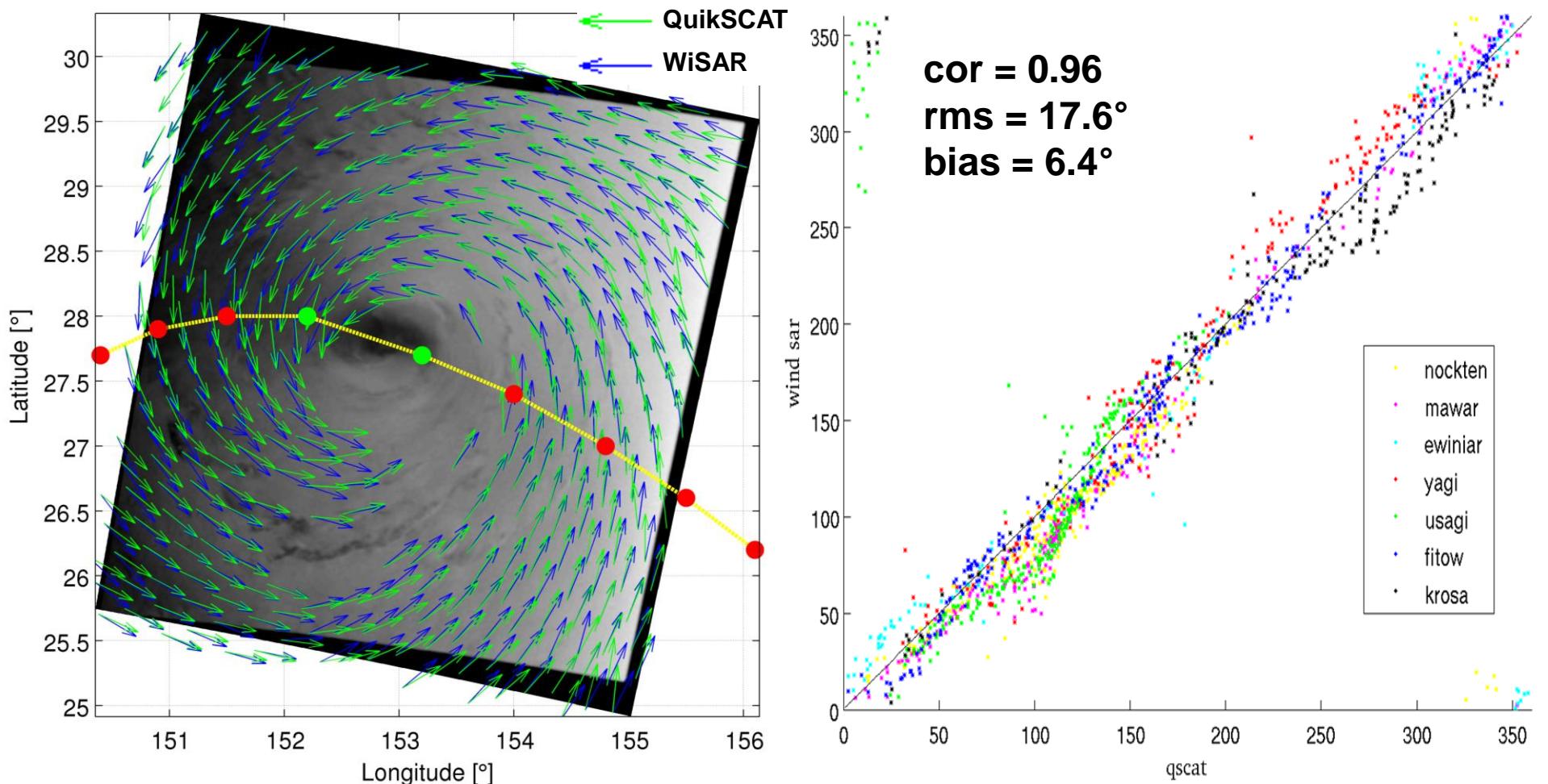


ECMWF winds

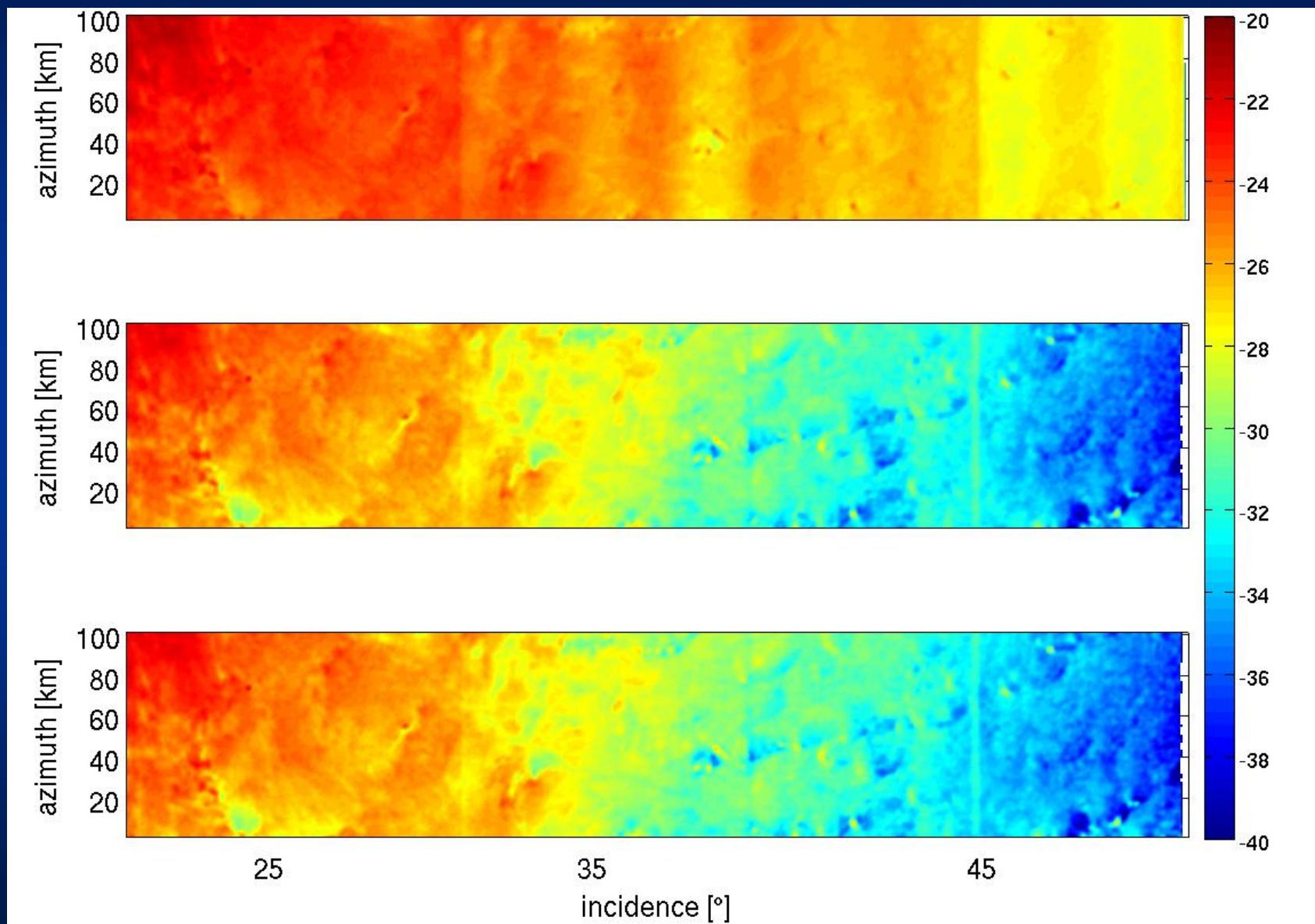


- Validation of the X-band GMF at high wind
- Investigation of X-band cross pol
- Merging of the co- and cross pol information for a even better wind product
- Including wave information in the wind retrieval

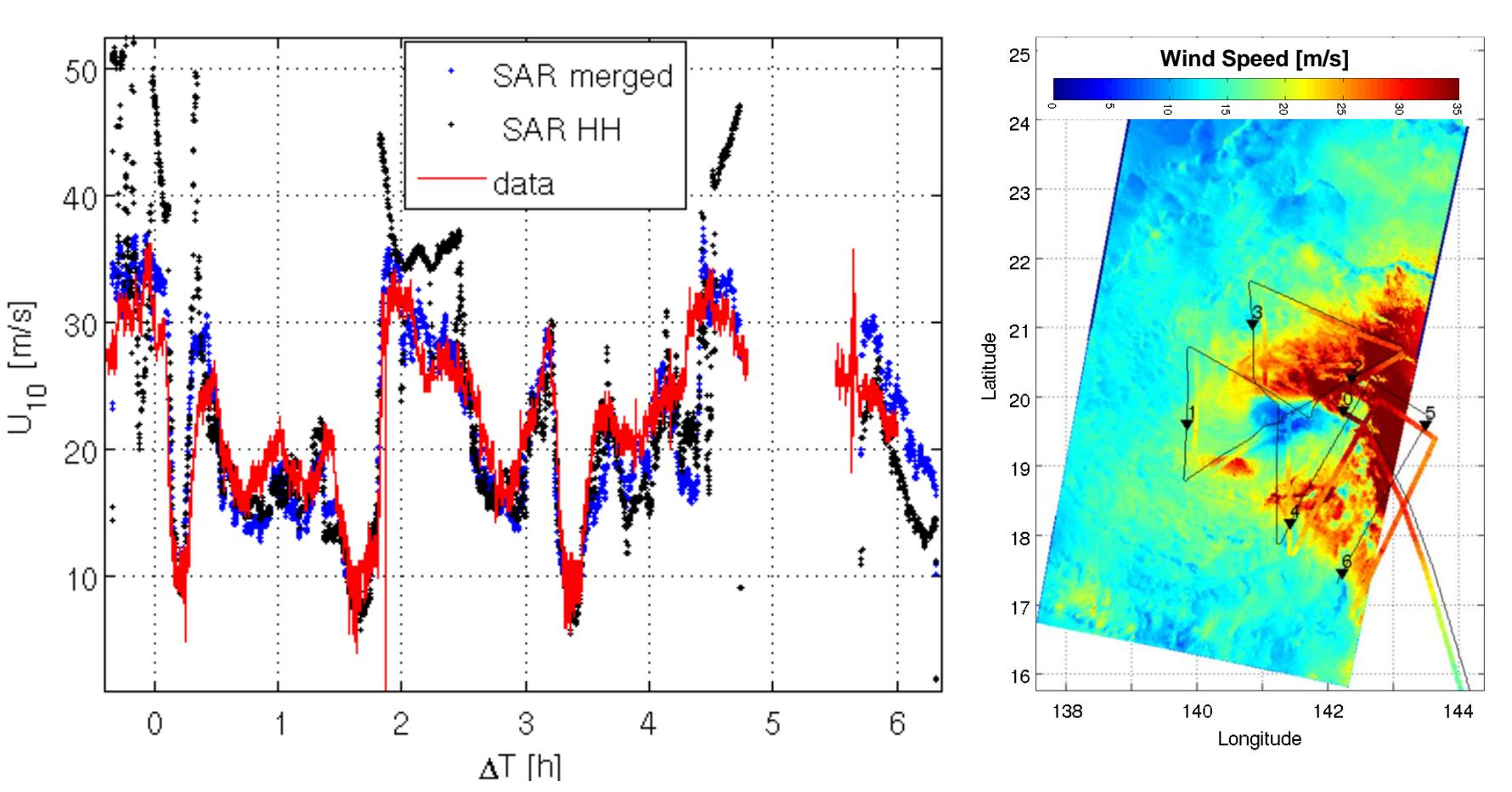
# Validation of SAR-Retrieved Wind Directions with QuikScat Winds



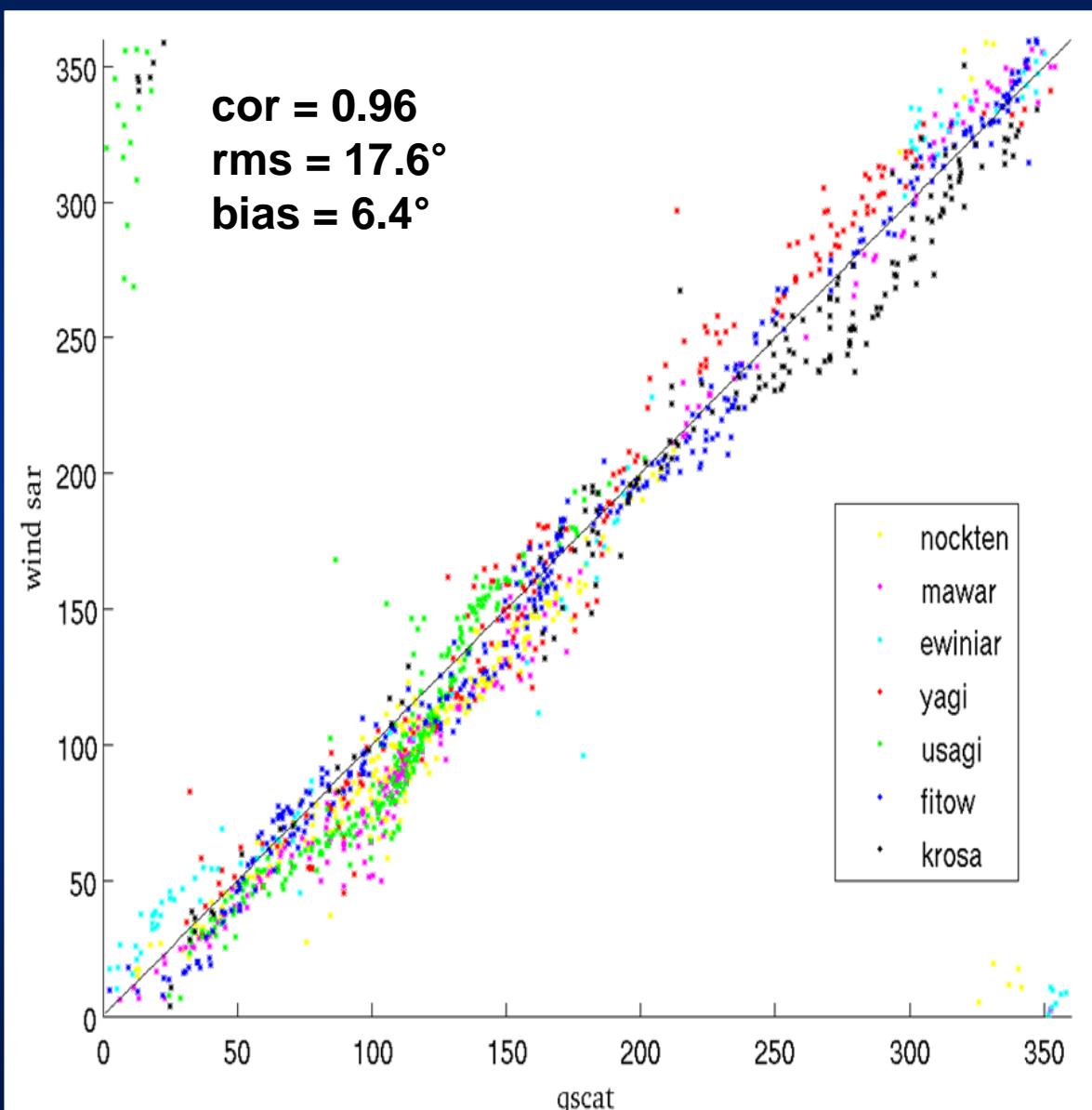
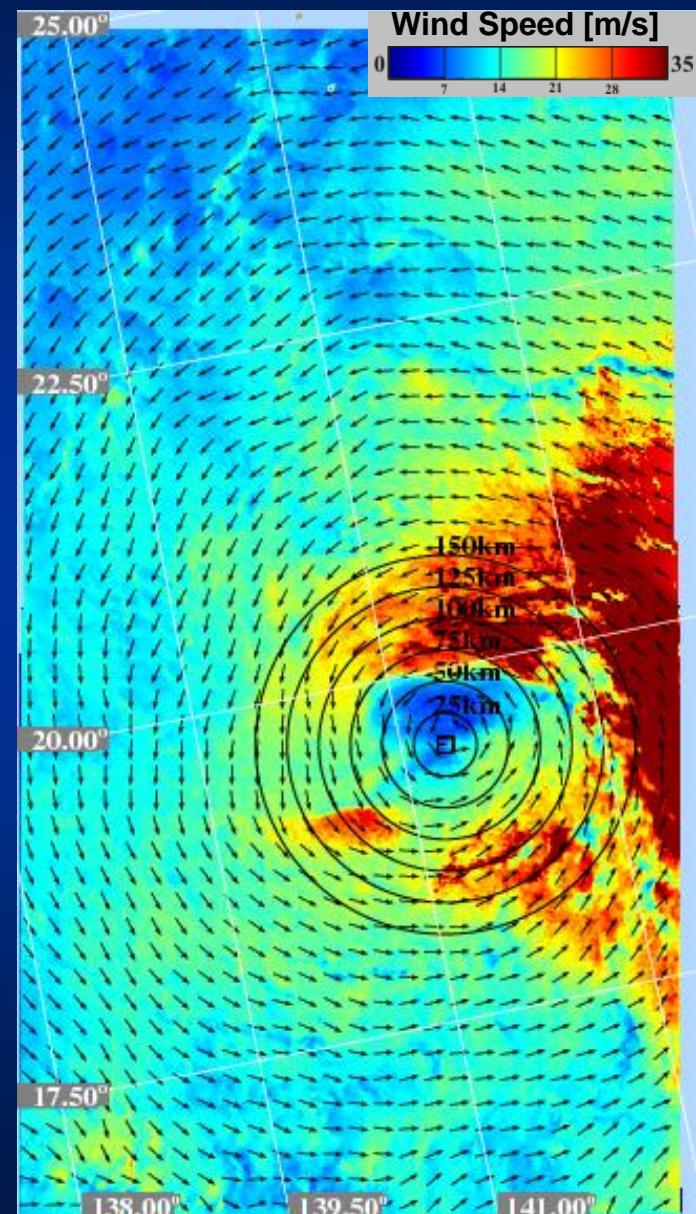
# Noise Correction of Radarsat-2 Cross Pol NRCS



# Comparison of Co- and Cross-pol Retrieved Wind Speeds to SFMR



# SAR-Retrieved Wind Field and Comparison to QuikScat data



# Comparison of Radar Retrieved Wind speeds to *in situ* Measured

$\sigma_0 \xrightarrow{\text{GMF}} u_{10}$  assuming 10 min mean neutral wind at 10 m

$u_{10} \rightarrow u_0$  assuming neutral stability

$u_0 \xrightarrow{\text{TC 3.x}} u_{\text{in situ}}$  taking available information on stability

## Estimation of Friction Velocity from Radar Measurements via GMF

$\sigma_0 \xrightarrow{\text{GMF}} u_{10}$  assuming 10 min mean neutral wind at 10 m

$u_{10} \xrightarrow{\text{TC 3.x}} u^*$  assuming neutral stability

# Noise Correction of Radarsat-2 Cross Pol NRCS

