

# Satellite altimetry in sea ice regions- detecting open water for estimating sea surface heights

Felix L. Müller, Denise Dettmering, and Wolfgang Bosch

Deutsches Geodätisches Forschungsinstitut (DGFI-TUM)  
Technische Universität München

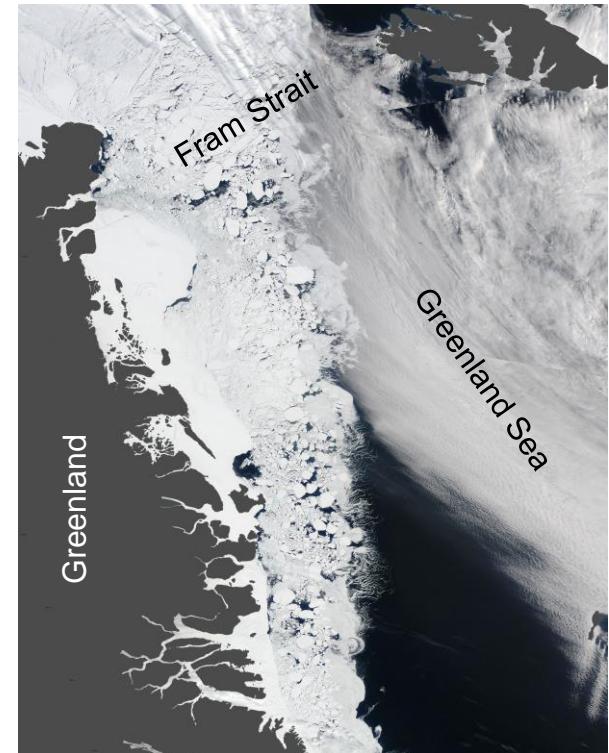
European Geoscience Union, General Assembly, 2017

Vienna, Austria 24.04.2017

# Introduction

Detecting open water (lead, polynya) to estimate sea surface heights (SSH) with multi-mission altimetry data in the Fram Strait and Greenland Sea

- Unsupervised classification approach of pulse-limited radar echoes without the use of a-priori known training data
- Automatic and quantitative evaluation of classification performance with pre-processed SAR images
- Mapping sea ice extent and its variation with radar altimetry
- Improving SSH estimation within the sea ice area



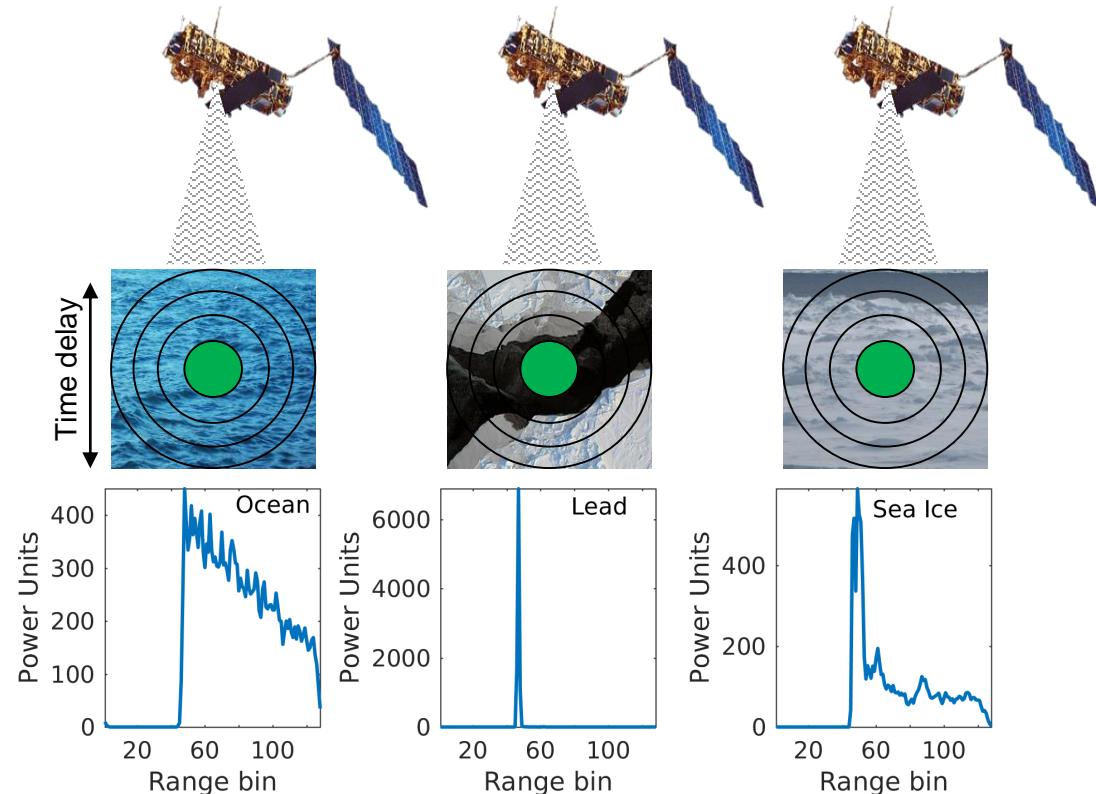
© Earth Observing System Data and Information System (EOSDIS), National Aeronautics and Space Administration (NASA)

# Altimetry: Measurement Principle and waveforms

Altimetry:

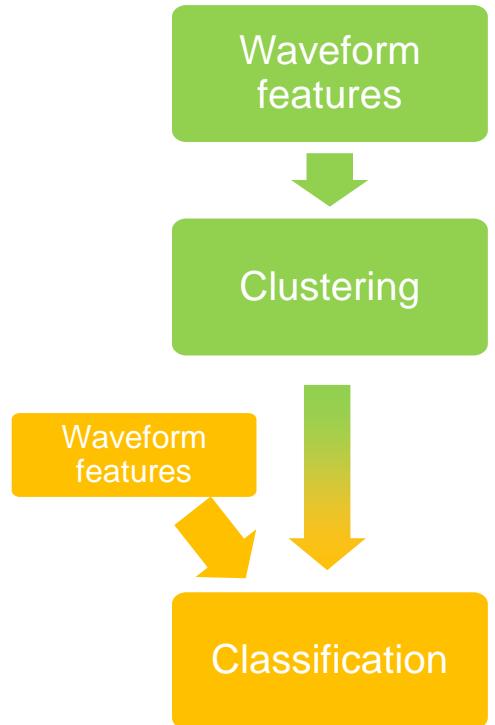
- Emitting of radar pulses (nadir)
- Receiving radar echoes (waveforms)
- Estimating distance between satellite and surface by interpreting waveform
- Information about surface conditions by analyzing waveform's shape and back scattered power

**Mission: ENVISAT (ESA)**



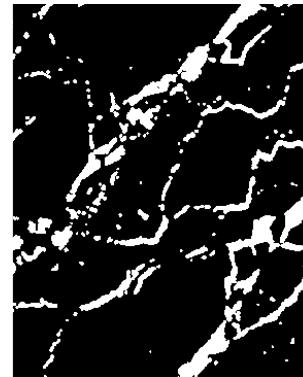
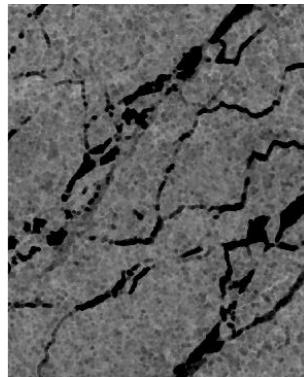
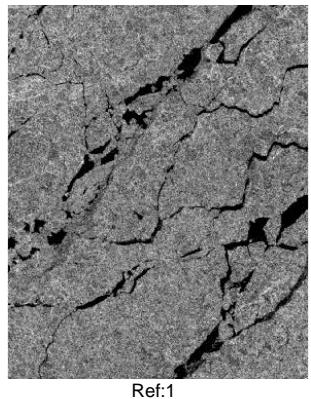
# Unsupervised classification

- Definition of waveform features
  - Maximum Power, Waveform width, Decay of trailing edge etc.  
(Parameters describe the waveform's shape and its features)
- Clustering of waveforms in 30 clusters applying K-medoids
  - Waveform reference model
- Assigning waveform clusters to surface conditions
  - 4 classes: calm water, ocean, sea-ice and undefined
- Classification of remaining waveforms using reference model and K-nearest neighbor
  - Classification result: WATER [1] | ICE [0] | UNDEFINED [0]  
(per measurement)



# Pre-processing of imaging SAR

Example: Sentinel-1A



- Noise reduction
- Dark pixel emphasizing

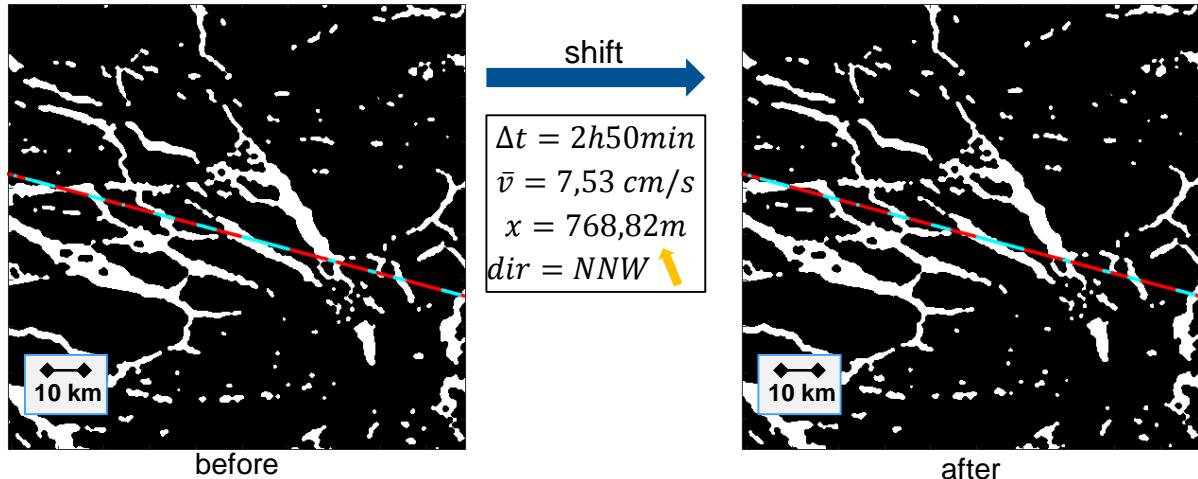
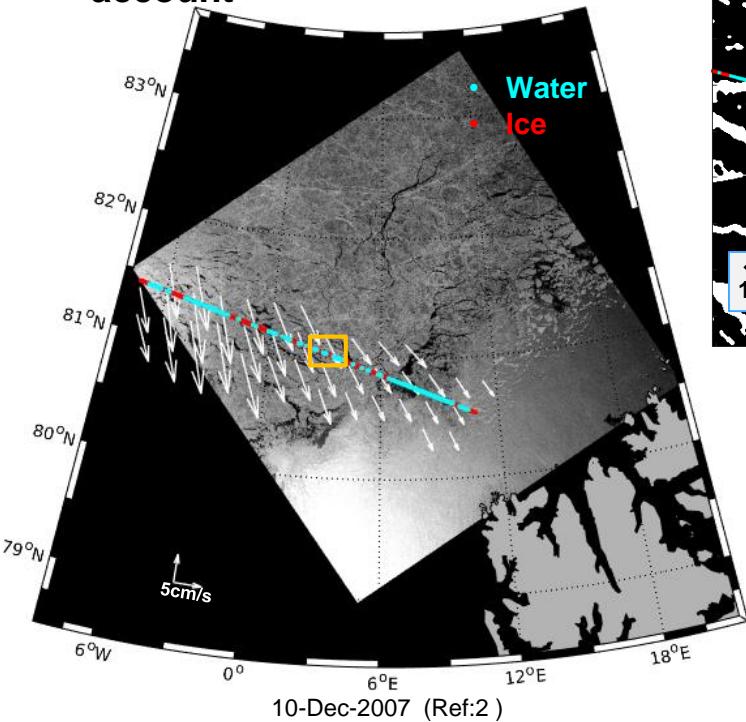
- Considering local SAR illumination changes
- Conversion to binary image

- Linking of segmented lead and polynya fragments

➤ Binarization of grayscaled SAR images

# Sea ice motion correction

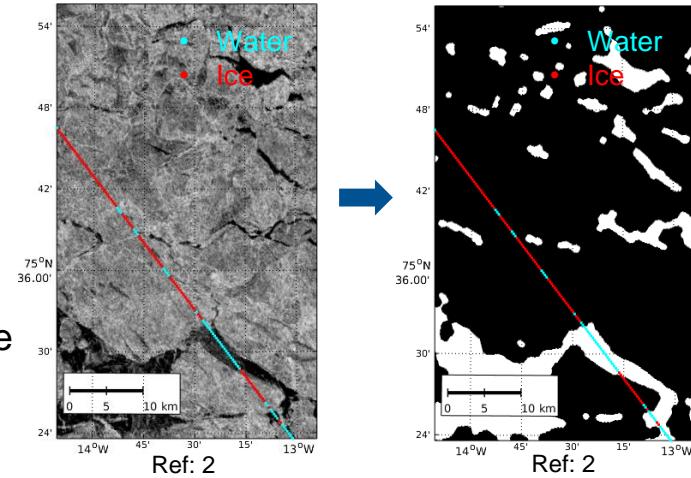
- Purpose: Taking ice motion into account



- Considering a mean sea ice motion with pixel-based shifting
- National Snow & Ice Data Center Daily Polar Pathfinder 25 km EASE-Grid Sea Ice Motion Vectors
- Improving the consistency between altimetry and SAR classification
- Applicable only for short acquisition time gaps (~3h)

# Quantitative comparison with imaging SAR

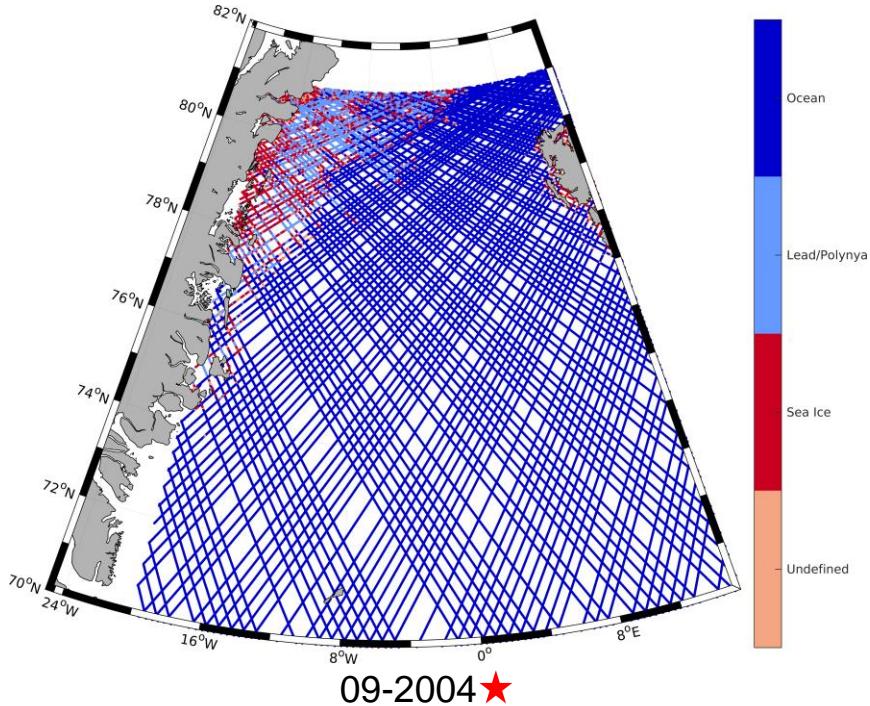
- Comparison between the altimetry and SAR classification results
- Computation of relative and absolute statistical information (contingency table)
  - Example:  $P(CR) = \frac{31+89}{141} \approx 0.85$  consistency rate
  - $P(ALT|SAR) = \frac{31}{35} \approx 0.89$  true water classification rate
- Processing of 19 image pairs (Radarsat-2/ALOS, 15025 altimetry observations) for Envisat classification located in the Fram Strait and Greenland Sea
  - $P(CR) = 70.7\%$ ,  $P(ALT|SAR) = 60.0\%$
- Possible causes: misclassification SAR/altimetry, acquisition time differences/sea ice motion,



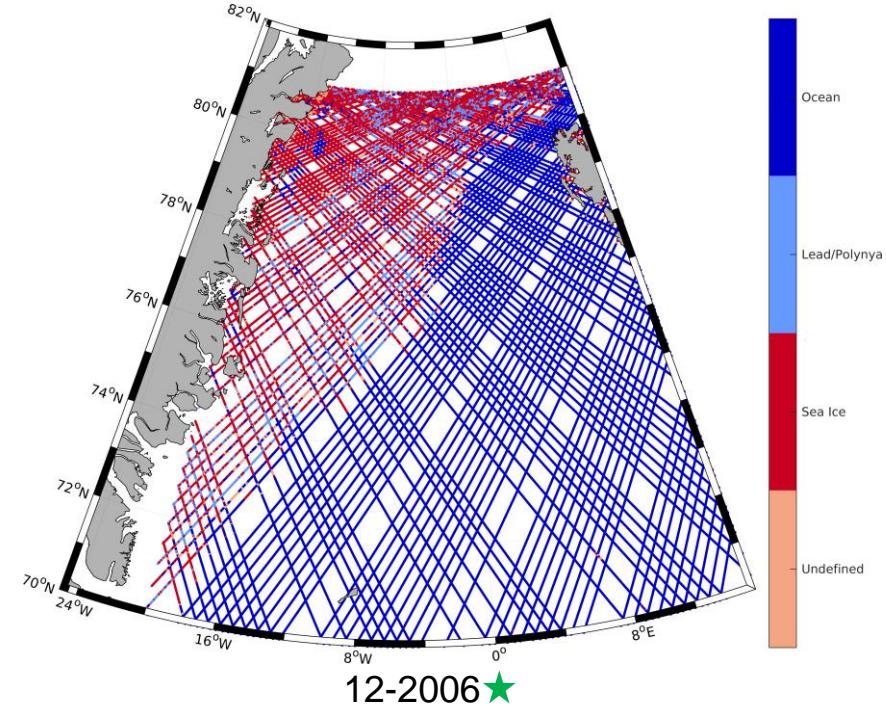
	ALT	ALT	$\Sigma$
SAR	31	4	35
SAR	17	89	106
$\Sigma$	48	93	141

contingency table

# Spatial distribution of sea-ice and open water areas



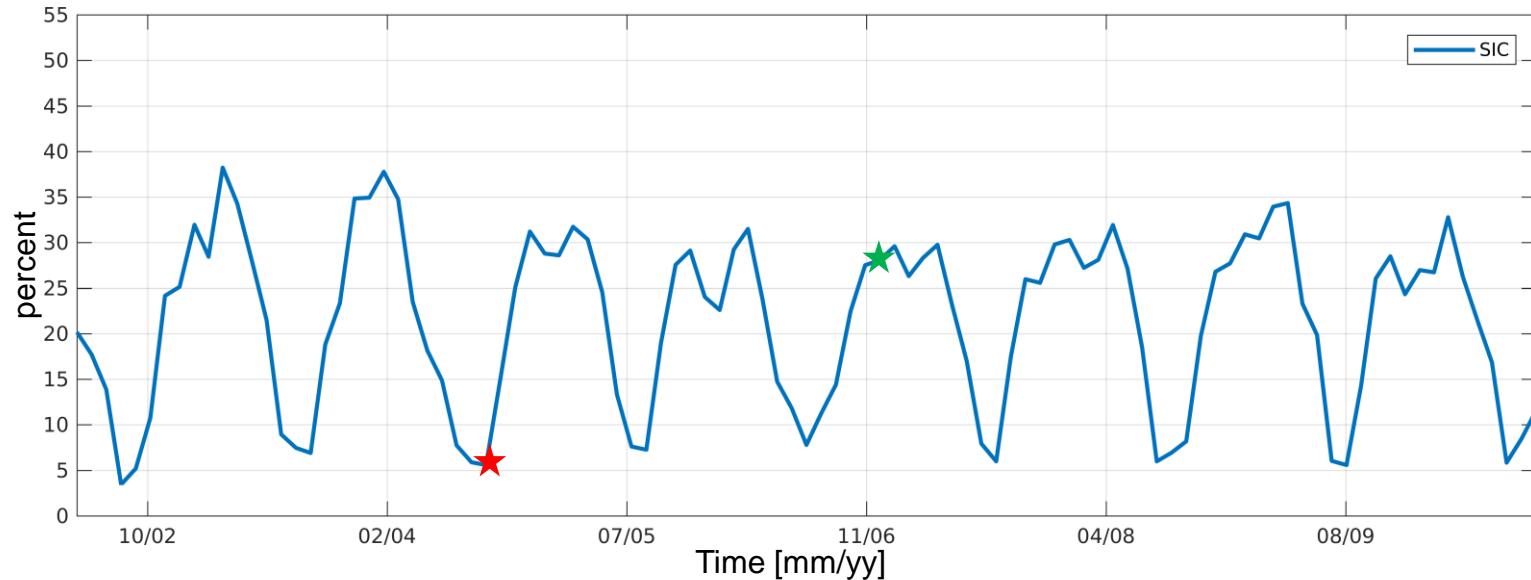
09-2004 ★



12-2006 ★

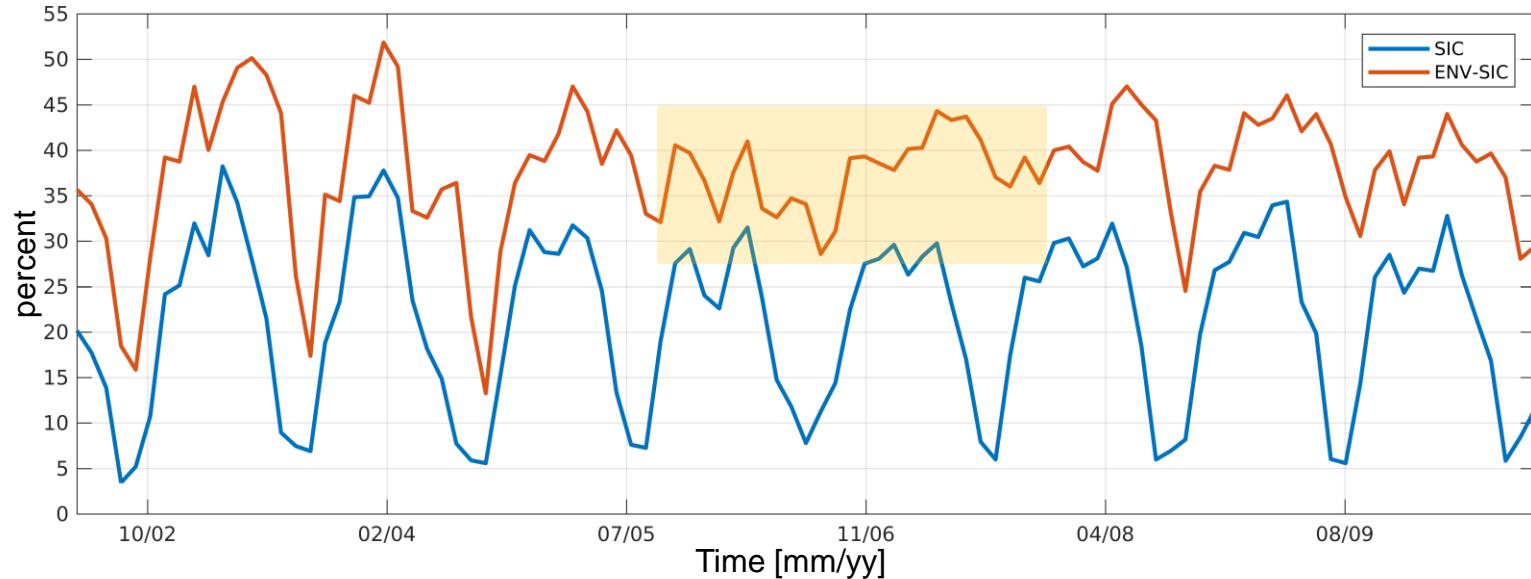
- Classification results: **Ocean**, **Lead/Polynya**, **Sea ice** and **Undefined** classes

# Temporal evolution of sea ice concentration (SIC)



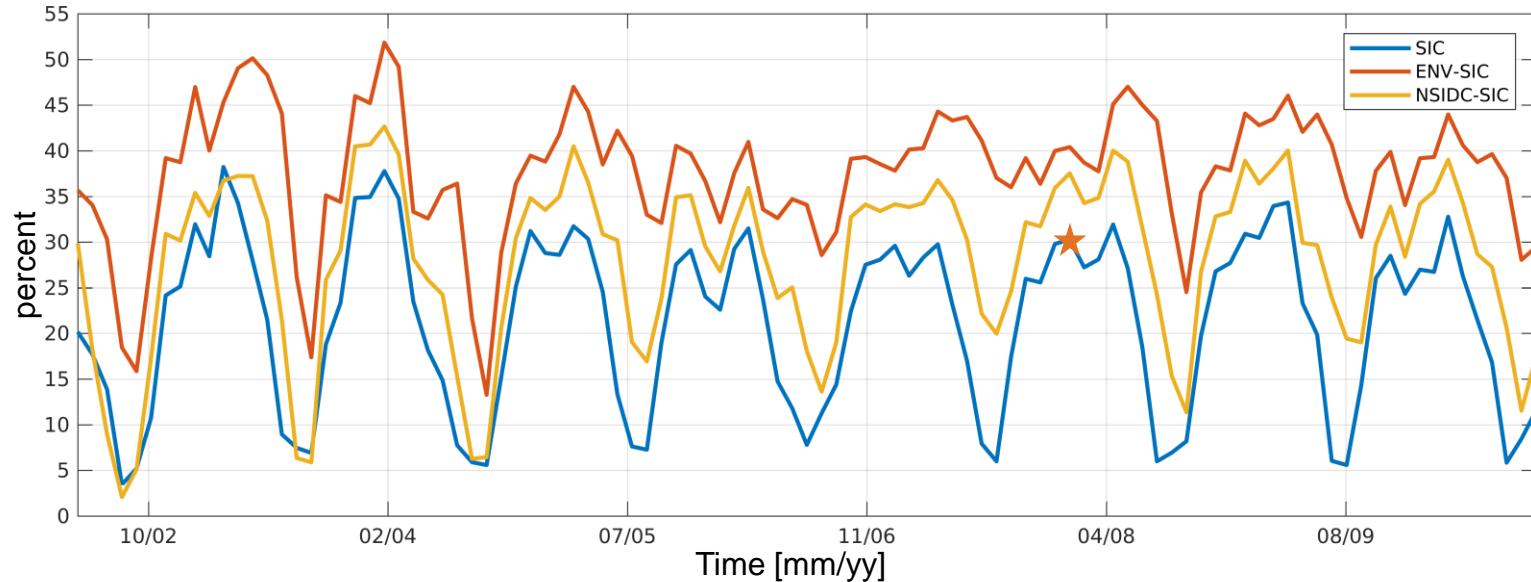
- SIC: Based on unsupervised sea ice classification
  - Significant seasonal variations
  - Max. SIC of about 40% due to large ocean area

# Temporal evolution of sea ice concentration (SIC)



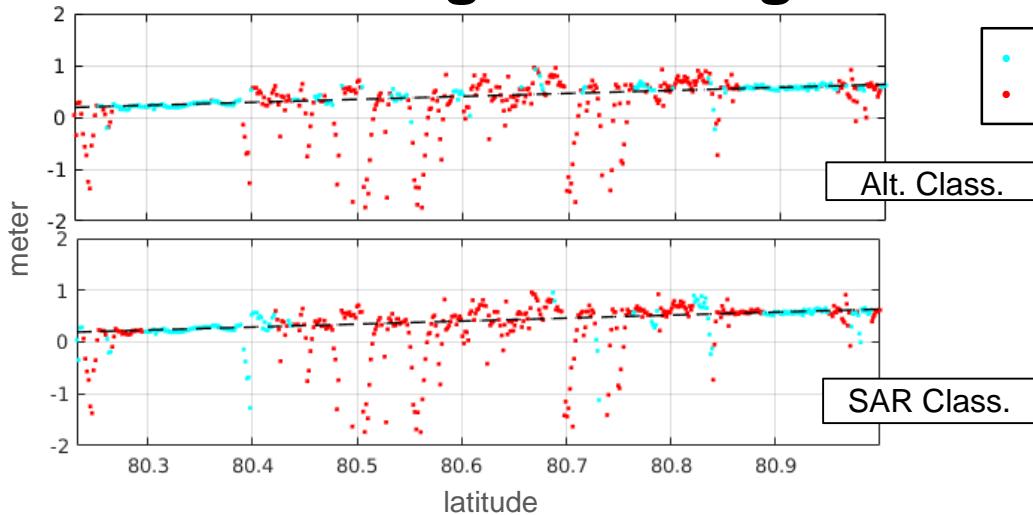
- SIC: Based on unsupervised sea ice classification
- ENV-SIC: Based on ENVISAT sea ice flag (Radiometer-Altimeter Combination)
  - Higher SIC due to lower spatial resolution (leads/polynyas are missed)
  - No seasonal effect in 2005 – 2007

# Temporal evolution of sea ice concentration (SIC)



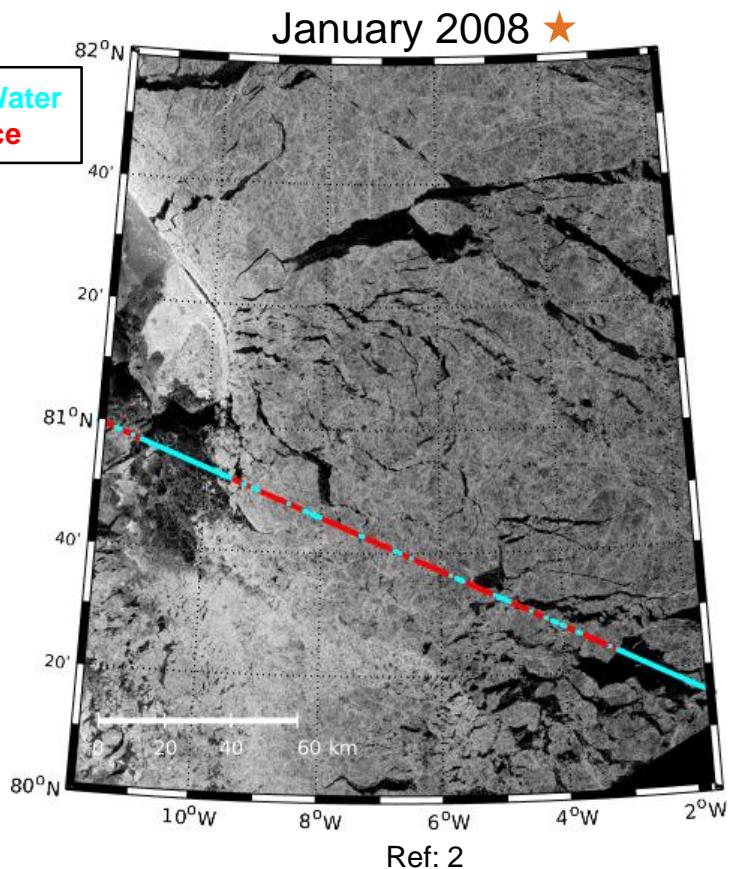
- SIC: Based on unsupervised sea ice classification
- ENV-SIC: Based on ENVISAT sea ice flag (Radiometer-Altimeter Combination)
- NSIDC-SIC: Based on moving average on National Snow & Ice Data Center gridded sea ice concentration (passive microwave + in-situ observations)

# Sea surface heights w.r.t. geoid



- SSH based on ALES+ retracker
- RMS of SSH residuals w.r.t. linear fitted altimetry water observations

$RMS_{all}$	$RMS_{SAR\ water}$	$RMS_{Alt.\ water}$
0.462 [m]	0.260 [m]	0.103 [m]



# Conclusion

- Unsupervised classification of ENVISAT (and SARAL) waveforms based on K-medoids and K-nearest neighbor has been performed in order to separate different waveforms and surface types
- Quantitative comparison with imaging SAR shows satisfying results (70% consistency)
- Classification allows for computation of sea ice concentration (SIC) and enables the estimation of sea surface heights (SSH) within the ice area
- Comparison with ENVISAT sea ice flag shows a lower total SIC and a higher sensitivity to seasonal sea ice variations
- Comparison with NSIDC SIC data shows good accordance to seasonal sea ice variability
- Classified sea surface heights w.r.t. to geoid of single ENVISAT tracks provide promising results (work in progress)

# Thank you for listening!

## More Information coming soon:

- Müller, F.L.; Dettmering, D.; Bosch, W.; Seitz, F.; Monitoring the Arctic seas: How satellite altimetry can be used to detect open water in sea-ice regions. *Remote Sensing.* (under review)
- Passaro, M.; Müller, F.L.; Dettmering, D. Lead Detection using Cryosat-2 Delay-Doppler Processing and Sentinel-1 SAR images. *Advances in Space Research.* (under review)

## Acknowledgements:

1. **Sentinel-1A data:** Sentinel-1 data provided by ESA, accessed: 28.04.2016
2. **ALOS data:** © JAXA/METI ALOS-1 PALSAR L1.5 2008. Accessed through ASF DAAC <https://www.asf.alaska.edu> 28.04.2016
3. **ENVISAT data:** ENVISAT SGDR 2.1 data provided by ESA

Comparison datasets:

- **ENVISAT Sea Ice Flag:** ENVISAT SGDR 2.1, see: Tran N., F. Girard-Ardhuin, R. Ezraty, H. Feng, and P. Femenias, "Defining a sea ice flag for Envisat altimetry mission", *IEEE GRS letters*, doi:10.1109/LGRS.2008.2005275, 6 (1), 77-81, 2009
- **NSIDC Sea Ice Concentration:** Cavalieri, D. J., C. L. Parkinson, P. Gloersen, and H. J. Zwally. 1996, updated yearly. Sea Ice Concentrations from Nimbus-7 SMMR and DMSP SSM/I-SSMIS Passive Microwave Data, Version 1. [Greenland Sea]. Boulder, Colorado USA. NASA National Snow and Ice Data Center Distributed Active Archive Center. doi: <http://dx.doi.org/10.5067/8GQ8LZQL0VL>. 19.04.2017.