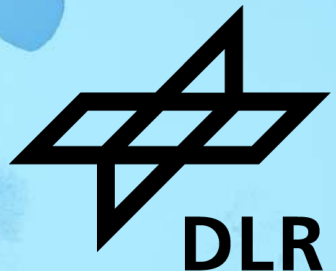
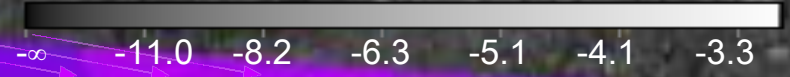


# On the location accuracy of deformation zones retrieved from spaceborne SAR image time series

Anja Frost, Martin Bathmann, Dmitrii Murashkin



Sigma Naught [dB]



Sea ice drift velocity [m/h]

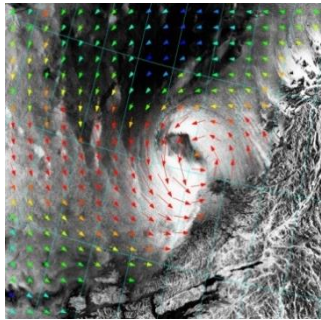


# DLR - German Aerospace Center

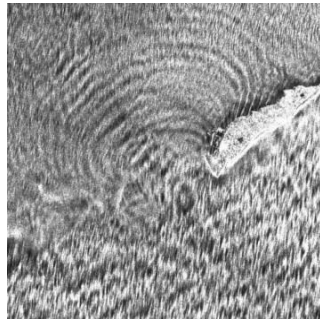


## Team SAR Oceanography Bremen

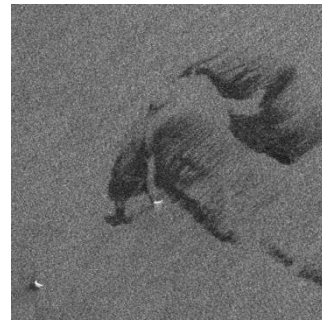
Development of algorithms to derive **maritime information** from **spaceborne SAR data** in **near real-time** on...



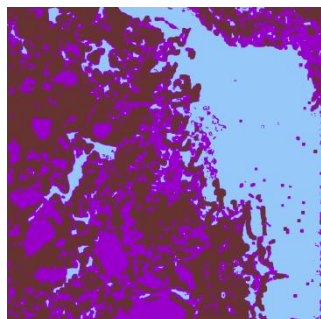
...wind



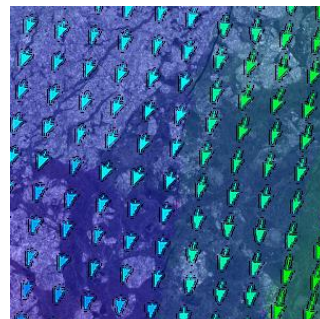
...sea state



...oil spills



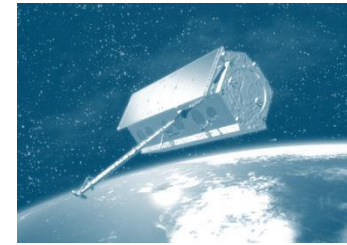
...sea ice types



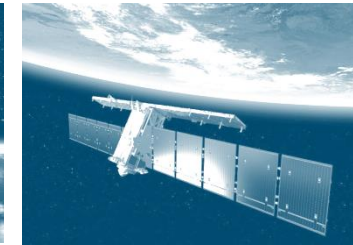
...sea ice drift



Support of campaigns  
Source: AWI



TerraSAR-X



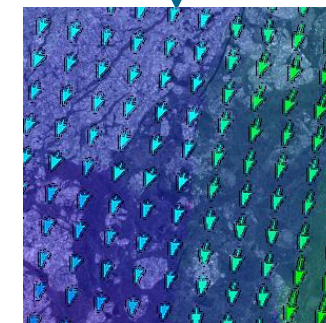
Sentinel1



... and others



Downlink at DLR ground segment network site



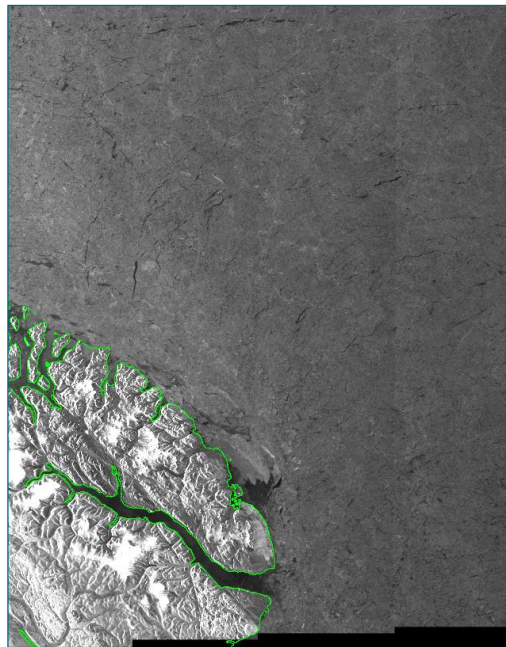
L0 processing and value adding

Delivery in NRT

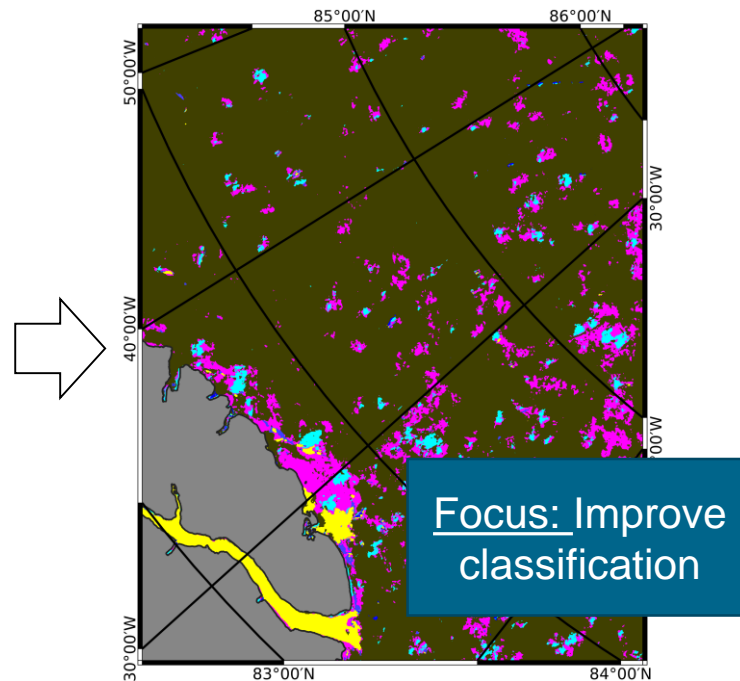


# AI based sea ice classification

Sentinel-1 acquisition  
06/12/2021 11:25 UTC



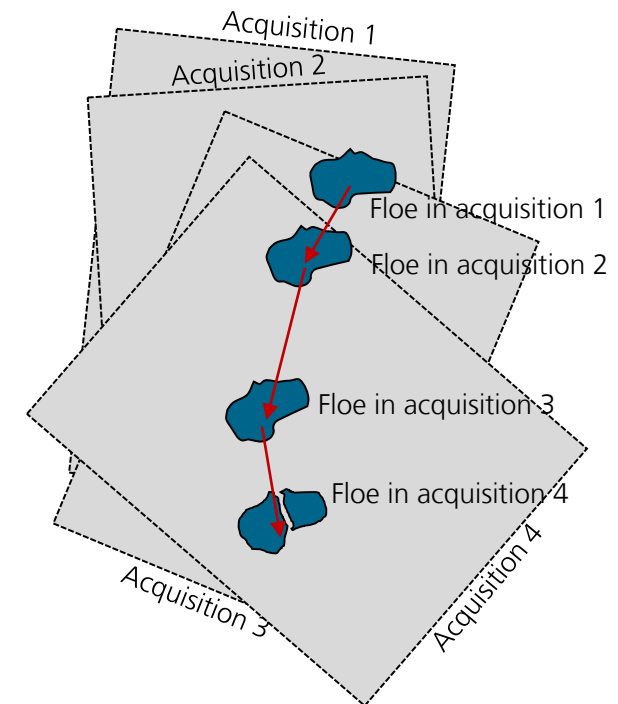
Sea ice classification  
based on UNET++ CNN [1, 2]



- |  |  |
|--|--|
|  Multi-year ice     |  First-year ice |
|  Open water (calm)  |  Young ice      |
|  Open water (rough) |  Rough ice      |

## Basic idea of multitemporal sea ice classification

- Track sea ice from one SAR acquisition to the next and collect more measurements about e.g. a floe
- Use the collected data jointly to classify the ice
- Needed: Sea ice drift tracking (hintcast) with very high accuracy and high resolution

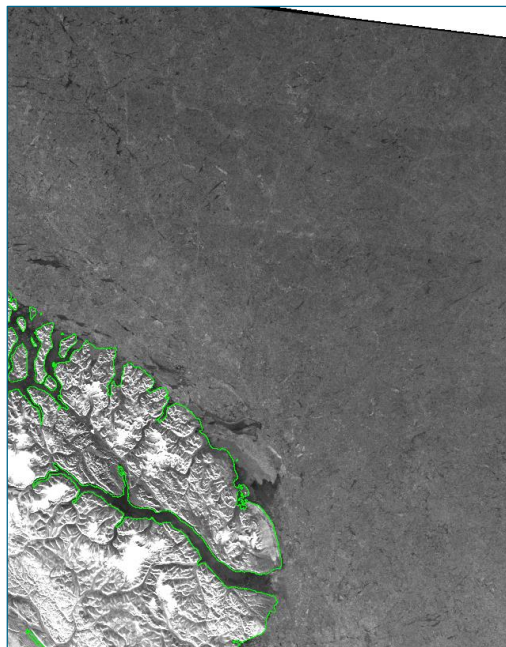


[1] Z. Zhou et al., IEEE 2020.

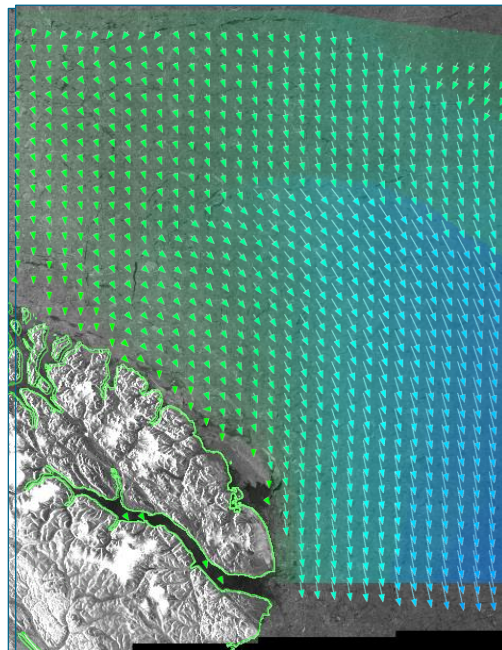
[2] Dmitrii Murashkin et al., "Arctic Sea Ice Mapping using Sentinel-1 SAR scenes with a Convolutional Neural Network" IGARSS 2021

# Sea ice drift tracking using phase correlation

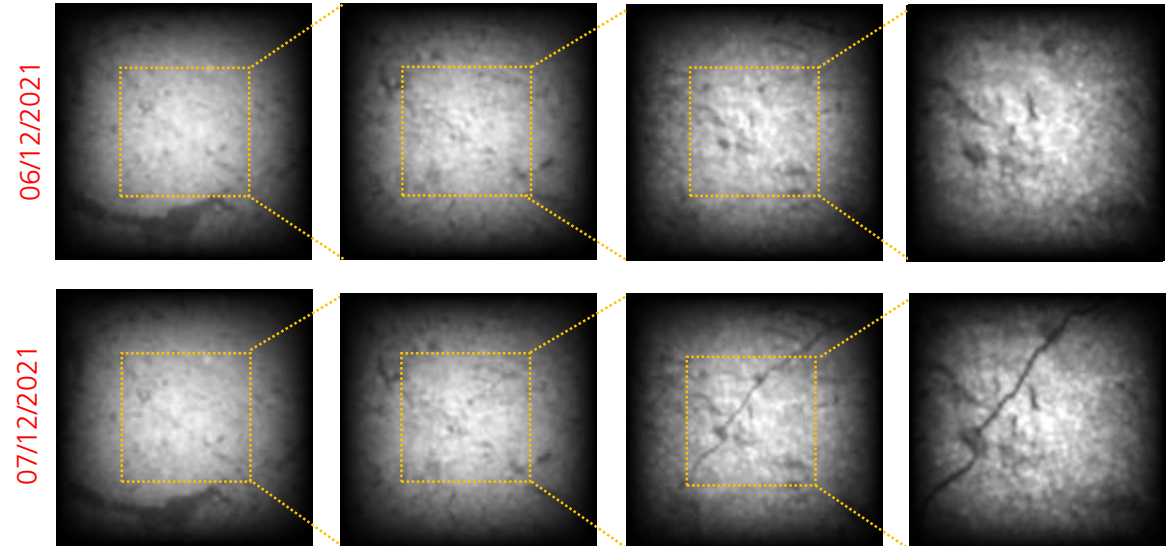
Sentinel-1 acquisition  
06/12/2021 11:25 UTC



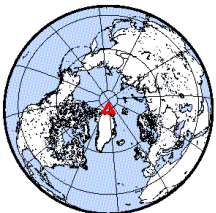
Sentinel-1 acquisition  
07/12/2021 17:51 UTC



1<sup>st</sup> res. level: 128 x 128 pix 40 km x 40 km  
2<sup>nd</sup> res. level: 128 x 128 pix 20 km x 20 km  
3<sup>rd</sup> res. level: 128 x 128 pix 10 km x 10 km  
4<sup>th</sup> res. level: 128 x 128 pix 5 km x 5 km



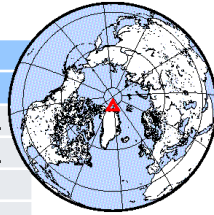
Evaluation of a whole patch



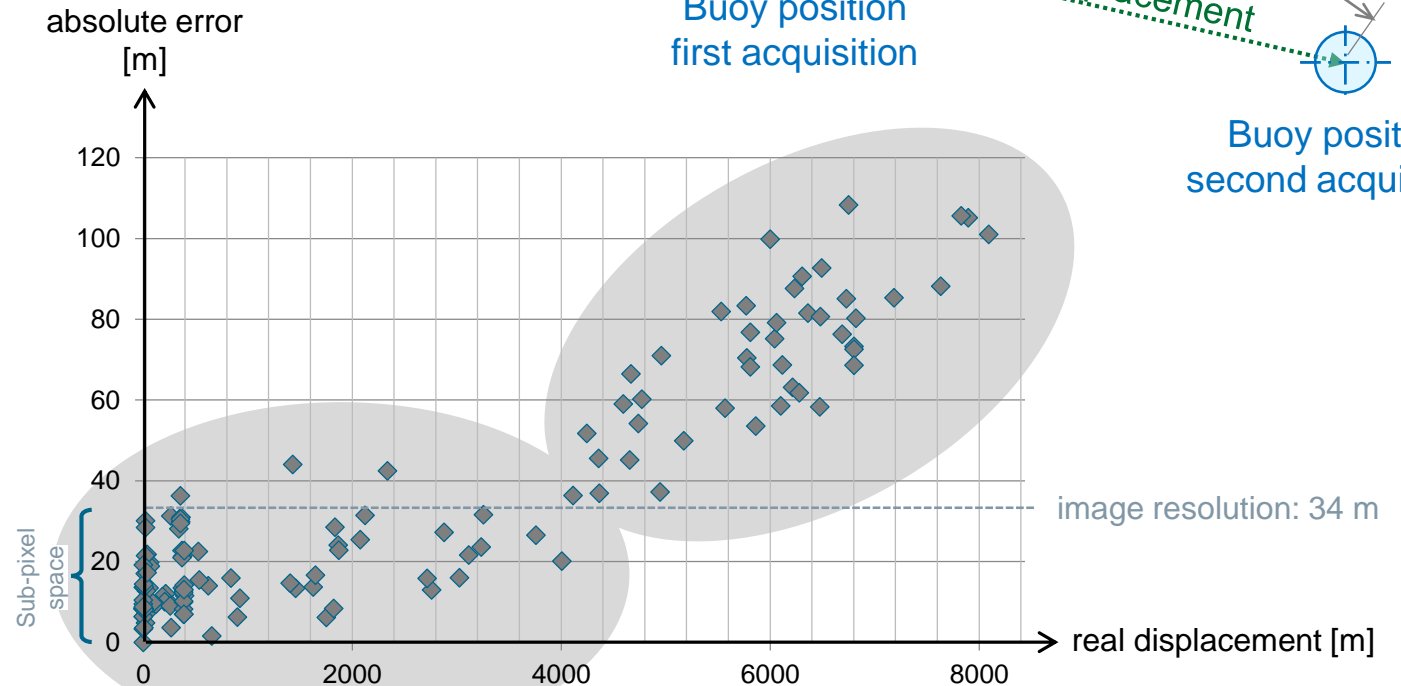
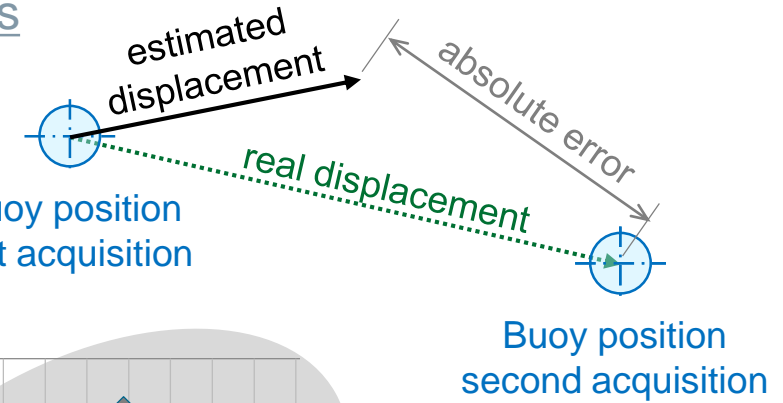
# Accuracy based on buoy measurements

TerraSAR-X acquisition

Date	Time [UTC]	Incidence angle	Heading angle	Orbit
03.03.2018	13:45	42°-34°	246°	desc.
03.03.2018	15:19	39°-30°	269°	desc.
03.03.2018	16:54	34°-42°	293°	asc.
04.03.2018	13:28	42°-34°	243°	desc.
04.03.2018	16:36	32°-41°	289°	asc.
05.03.2018	13:10	44°-36°	240°	desc.
05.03.2018	14:45	39°-30°	265°	desc.
06.03.2018	12:53	44°-36°	236°	desc.
06.03.2018	17:36	36°-44°	305°	asc.
07.03.2018	14:11	39°-30°	254°	desc.
07.03.2018	15:45	27°-37°	277°	asc.
08.03.2018	15:28	30°-39°	272°	asc.
08.03.2018	17:02	34°-42°	296°	asc.
09.03.2018	15:11	39°-30°	269°	desc.
09.03.2018	16:45	32°-41°	292°	asc.
10.03.2018	18:02	38°-46°	310°	asc.
12.03.2018	17:28	36°-44°	304°	asc.
13.03.2018	17:11	34°-42°	299°	asc.
14.03.2018	13:45	40°-32°	246°	desc.
14.03.2018	15:19	37°-27°	266°	desc.
14.03.2018	16:54	30°-39°	287°	asc.
15.03.2018	13:28	41°-32°	242°	desc.
16.03.2018	13:10	42°-34°	238°	desc.
16.03.2018	14:45	39°-30°	260°	desc.
17.03.2018	16:02	25°-35°	275°	asc.
17.03.2018	17:36	34°-42°	302°	asc.
20.03.2018	16:45	30°-39°	288°	asc.
20.03.2018	18:19	38°-46°	312°	asc.
21.03.2018	16:28	27°-37°	289°	asc.
23.03.2018	17:28	34°-42°	304°	asc.
24.03.2018	17:11	32°-41°	300°	asc.
26.03.2018	16:36	27°-37°	291°	asc.



## Validation with drift buoys



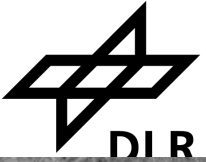
Up to a displacement of approx. 4 km:  
Absolute error ranges from 0 m to 44 m

Displacement between 4 km to 9 km:  
Absolute error ranges from 32 m to 108 m



... but drift buoys are usually deployed in the middle of an ice floe

# Accuracy in deformation zones (landfast ice boundary)

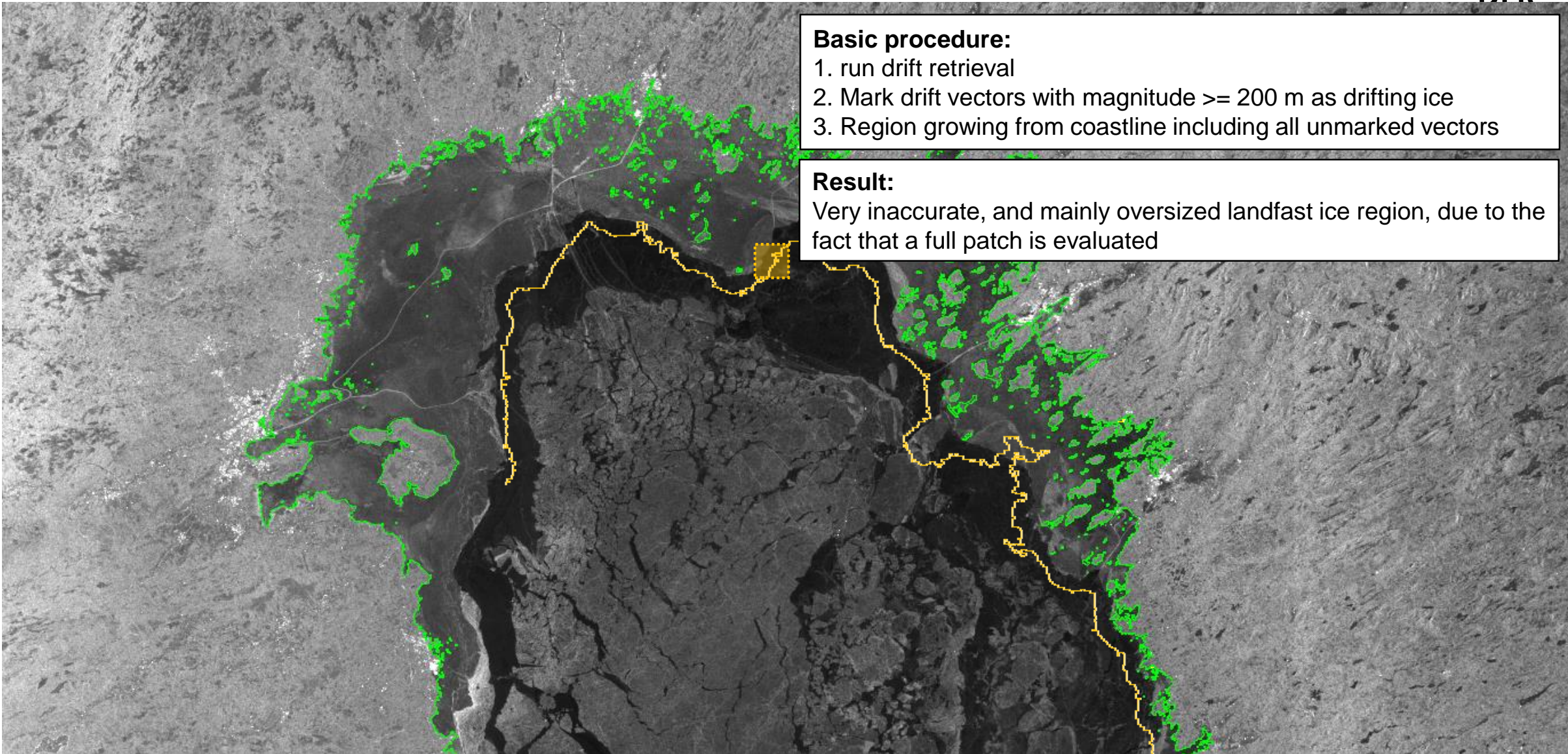


## Basic procedure:

1. run drift retrieval
2. Mark drift vectors with magnitude  $\geq 200$  m as drifting ice
3. Region growing from coastline including all unmarked vectors

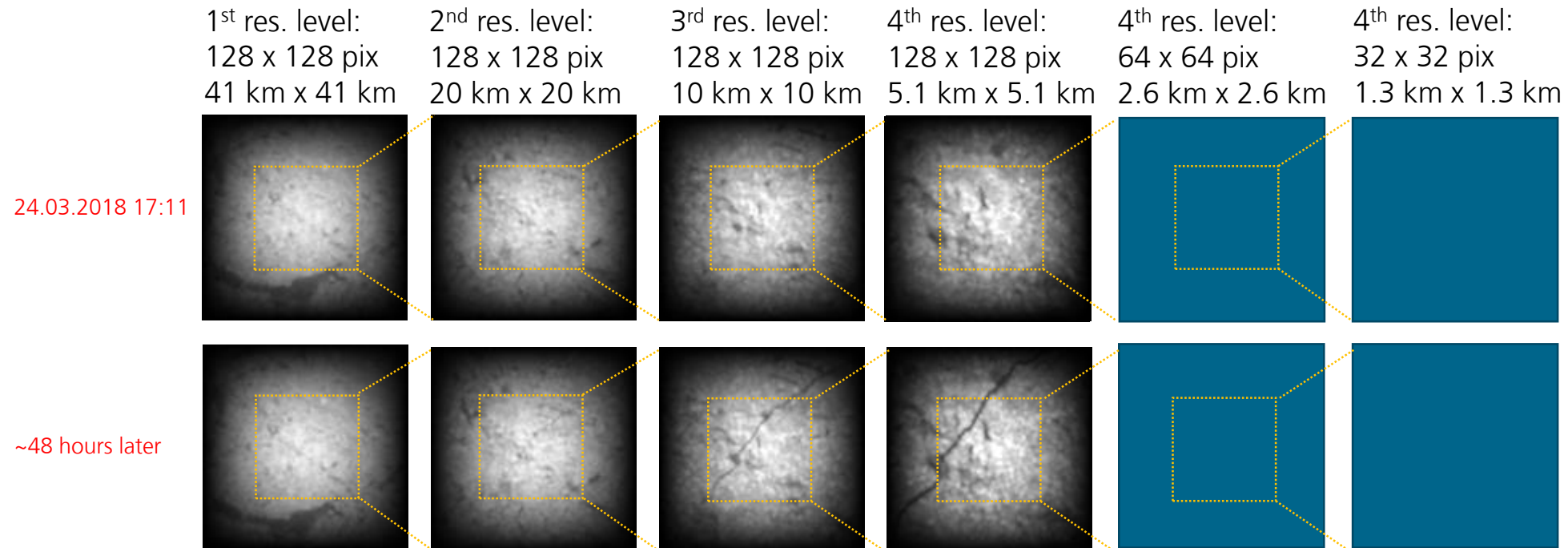
## Result:

Very inaccurate, and mainly oversized landfast ice region, due to the fact that a full patch is evaluated



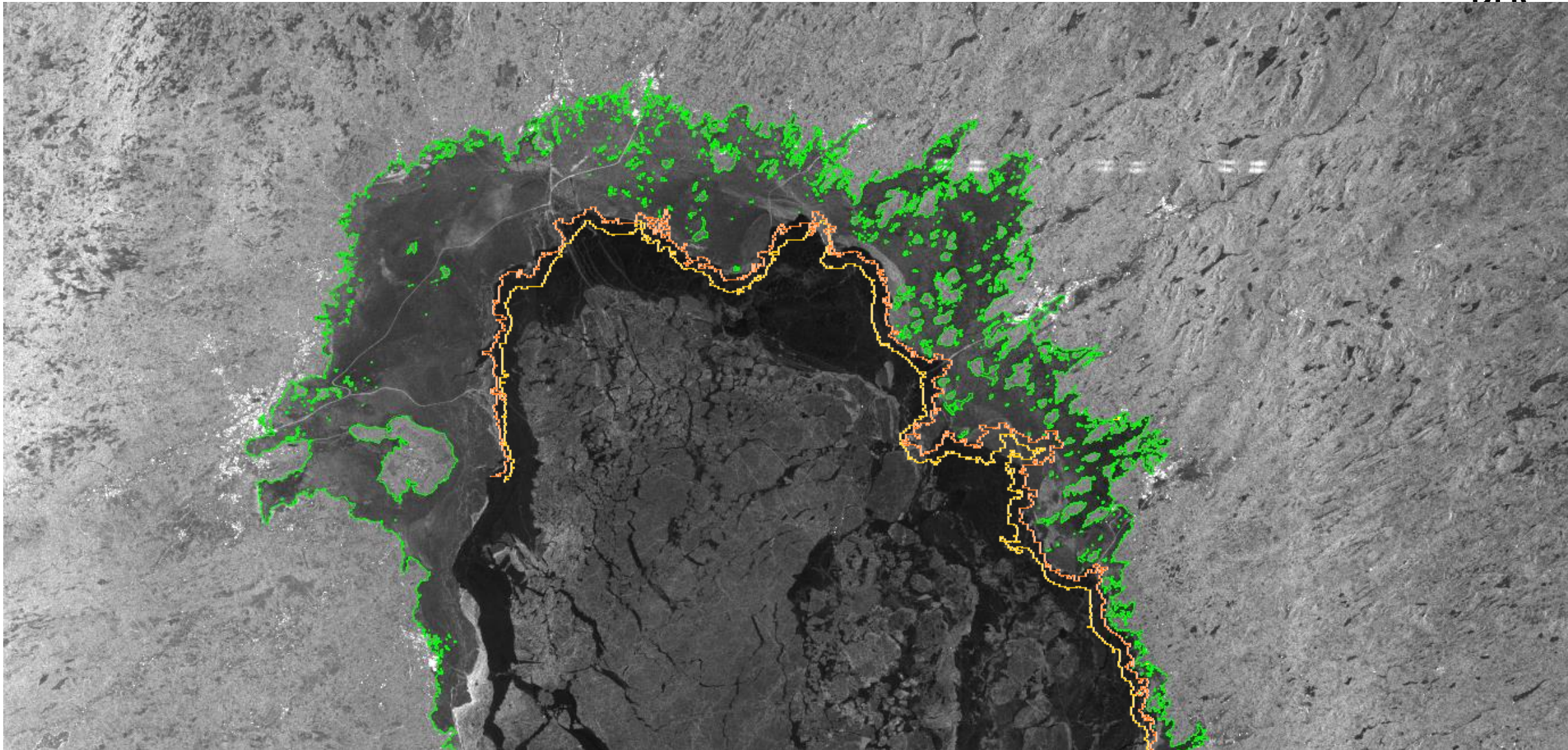
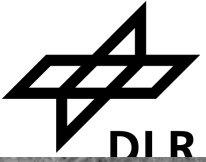


# How can results be improved by processing with way smaller patch sizes?



Original resolution reached.  
Now, reduce patch size.

# Accuracy in deformation zones (landfast ice boundary)



# Summary



- Within an ice sheet, sea ice drift can be tracked with very high precision
- Due to the block matching approach, boundaries of different moving ice sheets (i.e. deformation zones) can be misplaced by several kilometers, depending on block size
- First approach: Re-estimation of drift vectors with smaller patch sizes narrows down the deformation zones

## Ongoing

- For multitemporal sea ice classification, handle boundaries separately (anyhow, introduce new ice class “deformation zone”)
- Separate handling of boundary regions:
  - Interferometric analysis of landfast ice (vs. operational use)
  - Include other approaches for sea ice drift tracking

**A. Frost et al., IEEE OCEANS 2023**  
(first results on multitemporal sea ice classification including drift validation with >1000 buoy measurements)



# Knowledge gaps and deficiencies

- lack of in situ data
- free ice floe drift hard to track and predict

## Recommendation

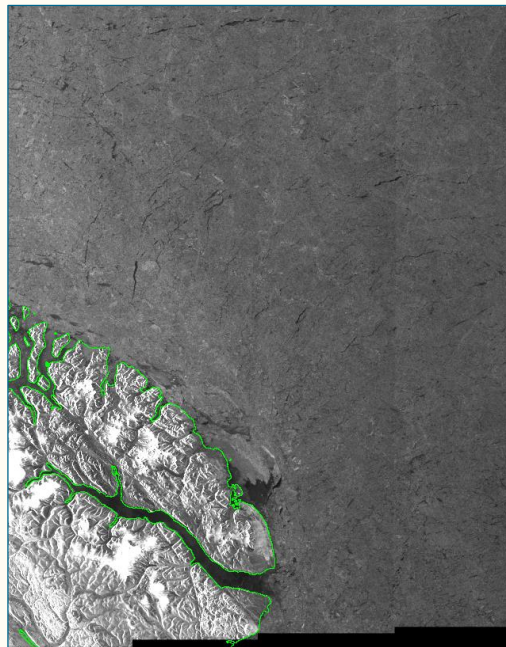
- More campaigns to collect in situ data
- Sea ice classification: Creation of open-source high-resolution dataset

## Opportunities

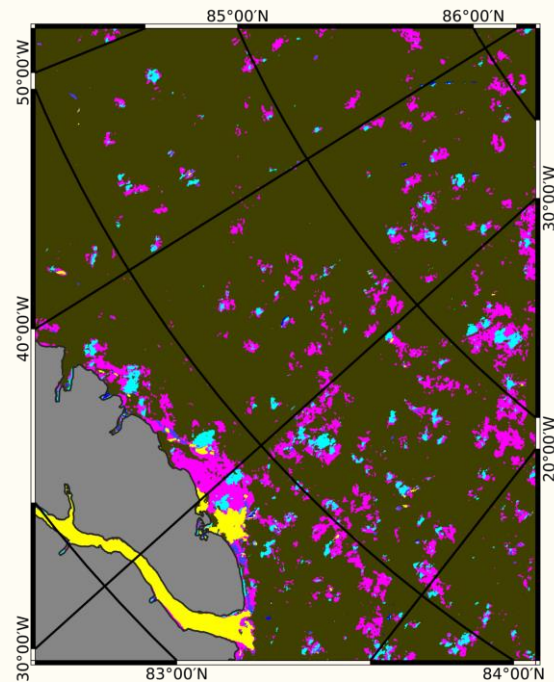
- Several large shipping companies could use Northwest passage to save costs, potential for marketable solution
- Large AI models incorporating multiple data sources might increase quality of EO-based sea ice information

# AI based sea ice classification morphed into the future

Sentinel-1 acquisition  
06/12/2021 11:25 UTC

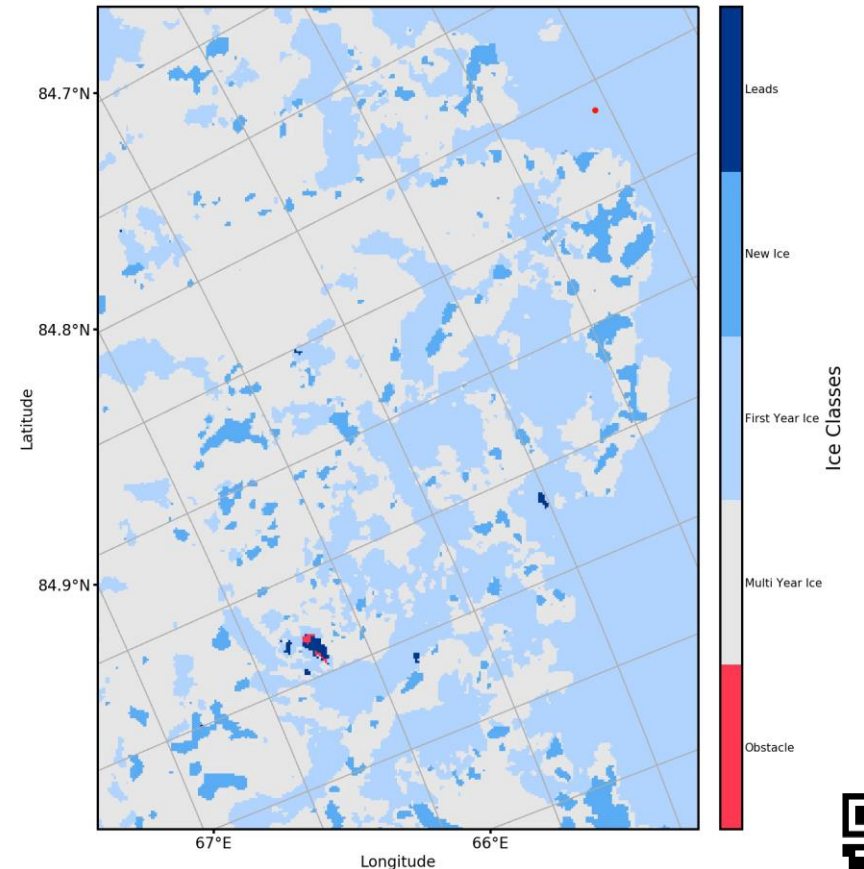


Sea ice classification  
based on UNET++ CNN [1, 2]



- Multi-year ice
- Open water (calm)
- Open water (rough)
- First-year ice
- Young ice
- Rough ice

High resolution sea ice types  
+  
Drift forecast  
+  
Ship capabilities  
=  
**Route suggestion**



[1] Z. Zhou et al., IEEE 2020.  
[2] Dmitrii Murashkin et al., "Arctic Sea Ice Mapping using Sentinel-1 SAR scenes with a Convolutional Neural Network" IGARSS 2021

Animation by Christine Eis, University of Bremen  
Ongoing in joint project **FAST-CAST 2** →

