



Assimilation of CryoSat-2 radar Freeboard data in a global ocean- sea-ice modelling system

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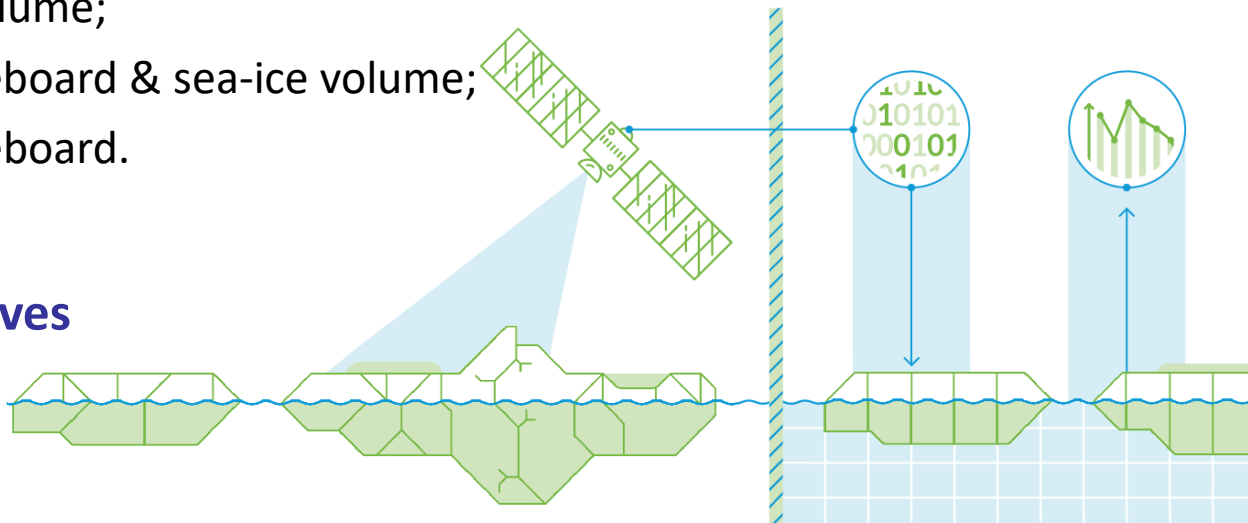
³ CNES, Toulouse, France

Development of a multidata/multivariate sea-ice analysis (operational purposes).

➤ Assimilation of CryoSat-2 Radar Freeboard products :

- **Method 1** : Sea-ice volume;
- **Method 2** : Radar freeboard & sea-ice volume;
- **Method 3** : Radar freeboard.

➤ Summary and perspectives



Model

Ocean:
Nemo 3.6

Sea-ice:
LIM3/Multi-
categories

Global $\frac{1}{4}^\circ$
grid

ERA5
atmospheric
forcing (1h)

Assimilation (Kalman filter)

- Analysis based on a 2D local multivariate Singular Evolutive Extended Kalman Filter (SEEEK)
- 7-days cycle ;
- 2 separate analyses :

1. Ocean Analysis

- Sea level anomaly, sea surface temperature, in situ data.

2. Sea Ice Analysis

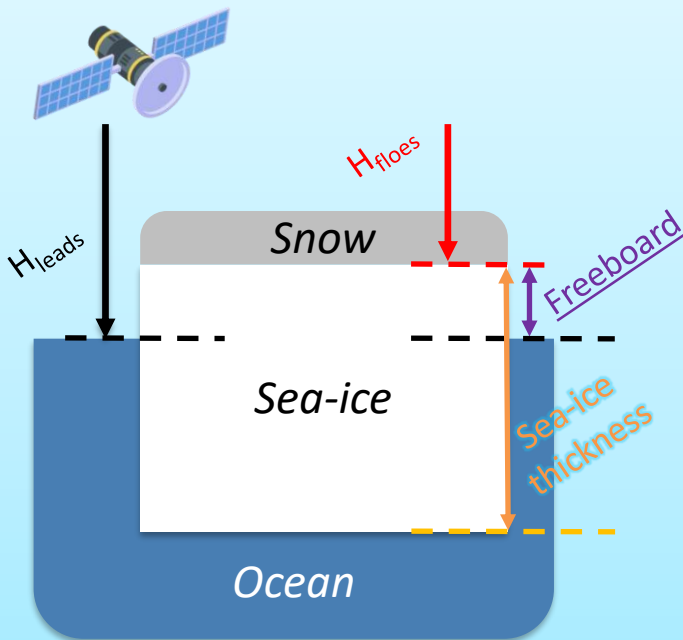
- Assimilation of sea-ice concentration from the OSISAF products (Ocean and Sea Ice Satellite Application Facility)

- **Objective:** add a **constraint on the SEA-ICE VOLUME**



Satellite measurement : Radar

Freeboard from CryoSat-2 (Laforge et al. 2020).



$$\text{Freeboard} = a \cdot H_{\text{ice}} + b \cdot H_{\text{snow}}$$

(a and b depending on the water, sea-ice and snow densities).

Model

Ocean:
Nemo 3.6

Sea-ice:
LIM3/Multi-
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ERA5
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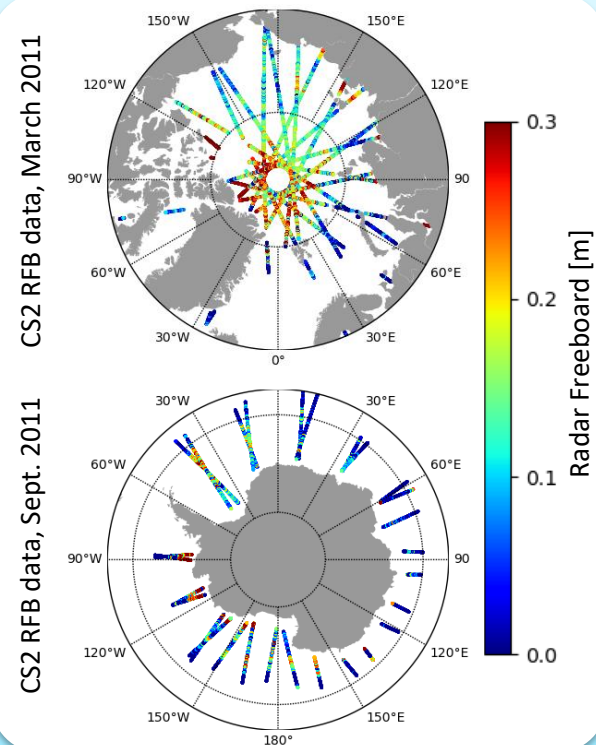
2. Sea Ice Analysis

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Satellite measurement : Radar Freeboard from CryoSat-2 (Laforge et al. 2020).



METHOD 1

Multidata :

- Assimilation of sea-ice concentration
- Assimilation of **SEA-ICE VOLUME**

build from along-track CryoSat-2 Radar FreeBoard & OSISAF sea-ice concentration & Warren99 climatology snow data.

METHOD 2

Multidata :

- Assimilation of sea-ice concentration
- Assimilation of **RADAR FREEBOARD VOLUME & SEA-ICE VOLUME**

build from along-track CryoSat-2 Radar FreeBoard & OSISAF sea-ice concentration data.

METHOD 3

Multidata :

- Assimilation of sea-ice concentration
- Assimilation of **RADAR FREEBOARD VOLUME**

build from along-track CryoSat-2 Radar FreeBoard & OSISAF sea-ice concentration data.

Multivariate analysis :

- Multivariate state vector :

$$\begin{bmatrix} \text{sea - ice} & \text{sea - ice} \\ \text{concentration} & \text{volume} \end{bmatrix}$$

Multivariate analysis :

- Sea Ice assimilation experiment using multivariate state vector

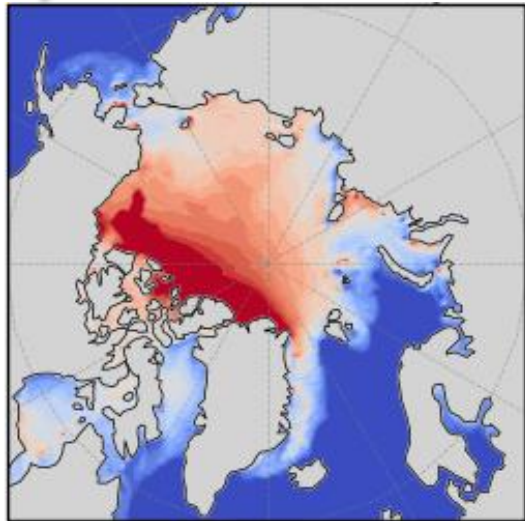
$$\begin{bmatrix} \text{sea - ice} & \text{freeboard} & \text{sea - ice} & \text{snow} \\ \text{concentration} & \text{radar volume} & \text{volume} & \text{volume} \end{bmatrix}$$

METHOD 1 : Assimilation of sea-ice volume

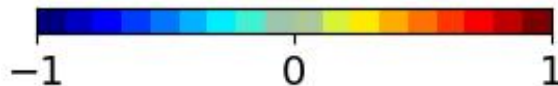
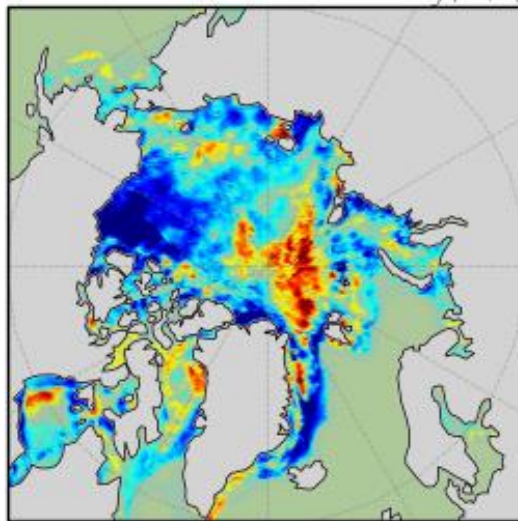
RESULTS

Sea Ice Volume [m]

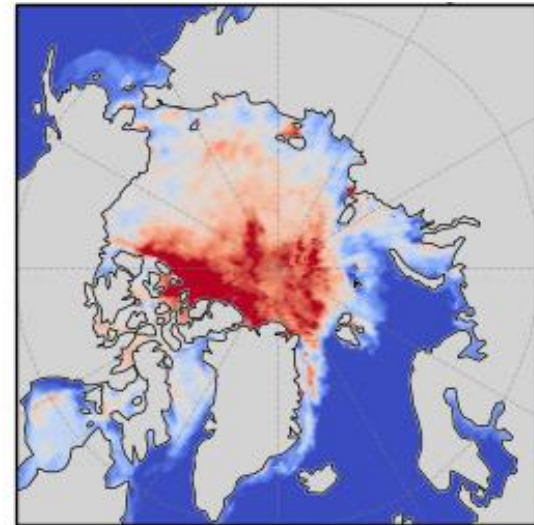
7-day cycle (March) after 3 months of simulation (Jan -> March 2011)



Run without assimilation



Impact of the assimilation
(difference left – right)

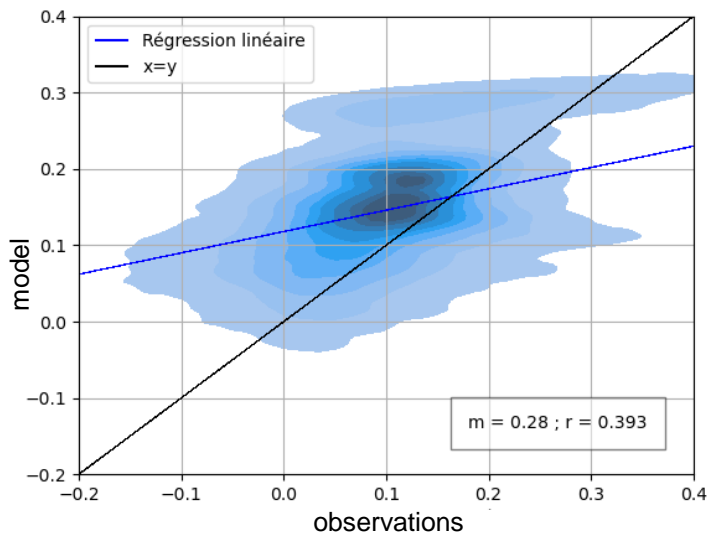


Run with assimilation (sea-ice concentration & volume)

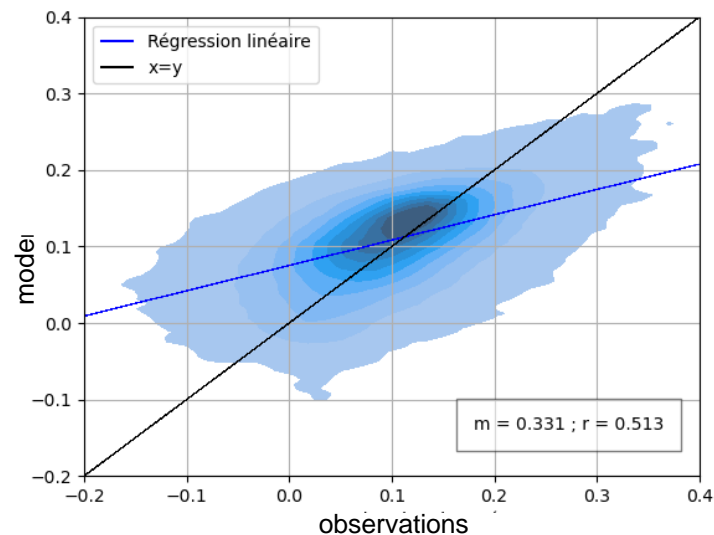
RESULTS

Comparison with assimilated dataset :
CryoSat-2 Radar Freeboard [m]

Without assimilation



With assimilation



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build from along-track CryoSat-2 Radar FreeBoard & OSISAF sea-ice concentration data.

METHOD 3

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Multivariate analysis :

- Multivariate state vector :

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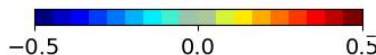
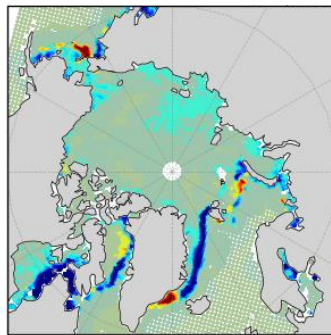
$$\begin{bmatrix} \text{sea - ice} & \text{freeboard} & \text{sea - ice} & \text{snow} \\ \text{concentration} & \text{radar volume} & \text{volume} & \text{volume} \end{bmatrix}$$

RESULTS

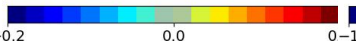
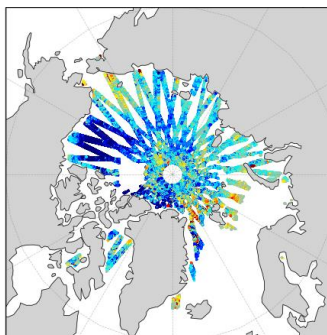
Innovation

= difference obs - model

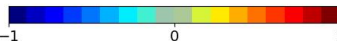
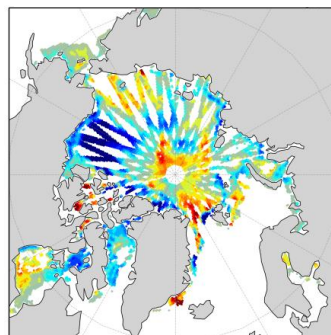
Sea-Ice Concentration
(OSI-SAF)



Radar FreeBoard Volume
(from CryoSat-2)



Sea-Ice Volume
(CryoSat-2 SMOS, AWI)

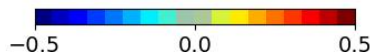
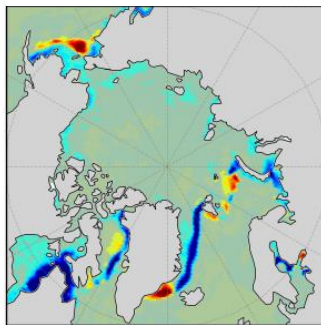


Sea Ice Analysis
7-day Cycle
3-10 jan. 2011

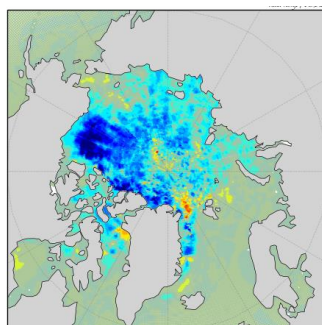
$$\text{Radar Freeboard} = a \cdot H_{\text{ice}} + b \cdot H_{\text{snow}}$$

Analysis update

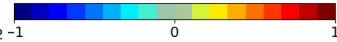
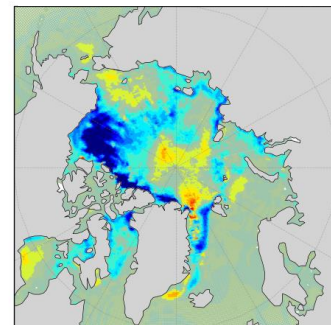
Sea-Ice Concentration



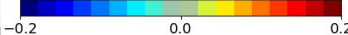
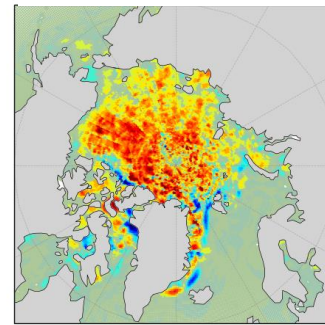
Radar FreeBoard Volume



Sea-Ice Volume



Snow Volume



METHOD 3 : Assimilation of radar freeboard

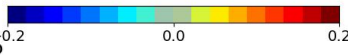
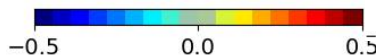
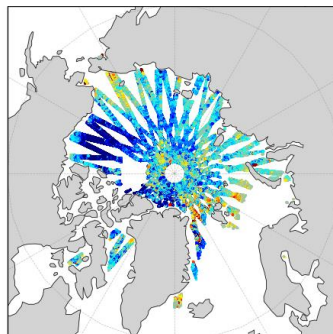
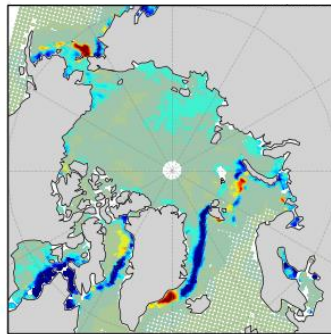
RESULTS

Innovation

= difference obs - model

Sea-Ice Concentration
(OSI-SAF)

Radar FreeBoard Volume
(from CryoSat-2)



Sea Ice Analysis
7-day Cycle
3-10 jan. 2011

$$\text{Freeboard Radar} = a \cdot H_{\text{ice}} + b \cdot H_{\text{snow}}$$

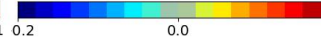
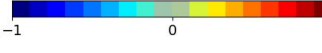
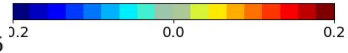
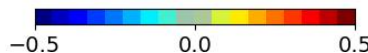
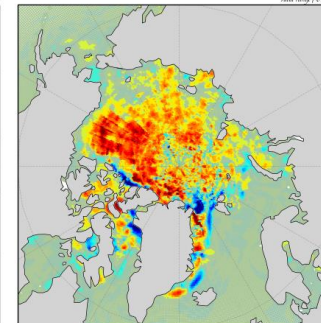
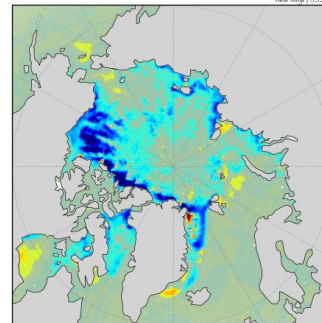
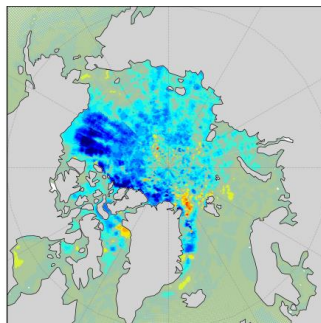
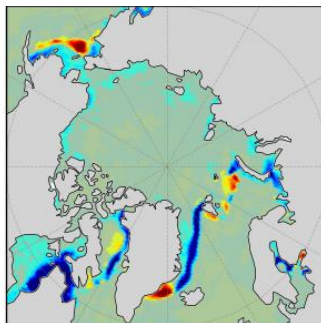
Analysis update

Sea-Ice Concentration

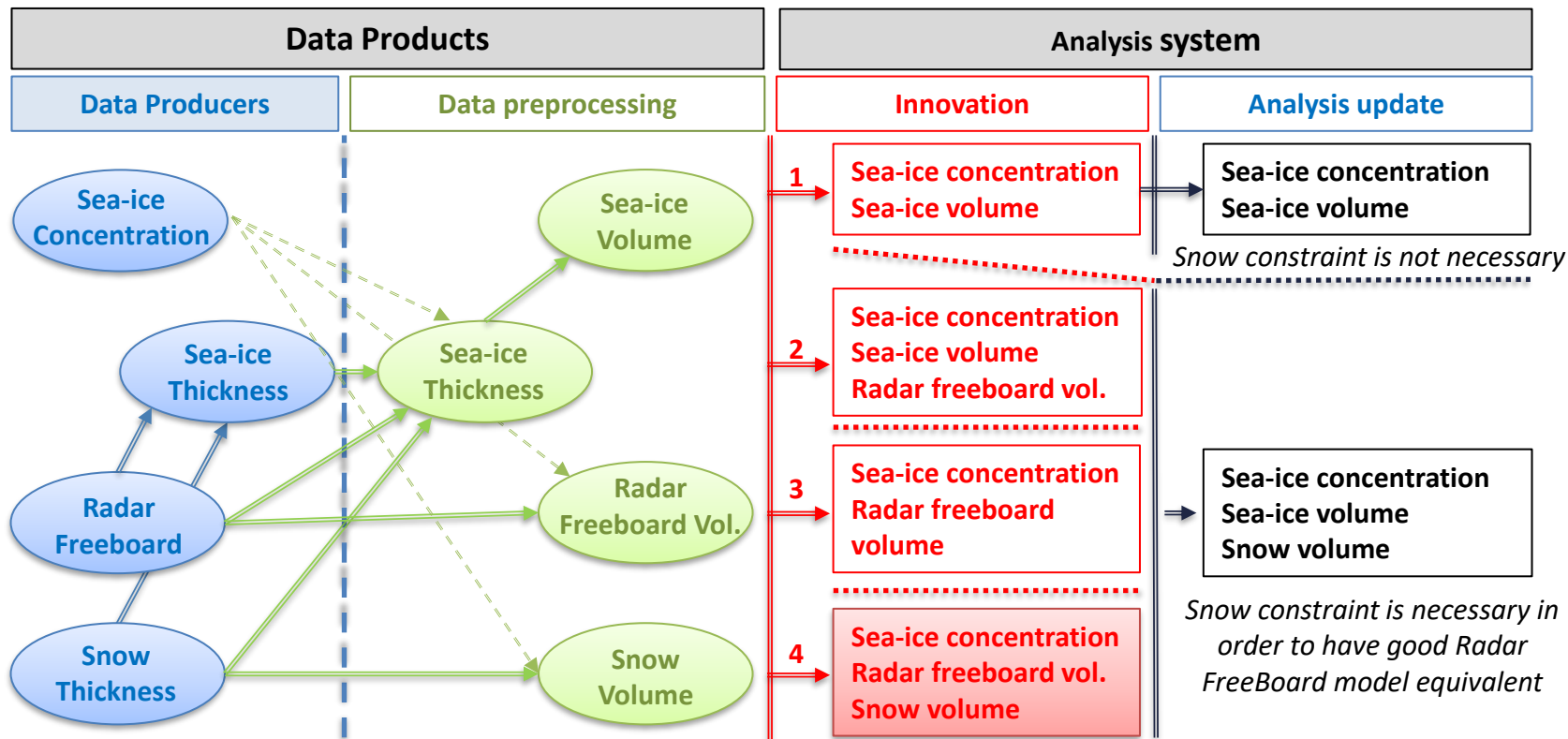
Radar FreeBoard Volume

Sea-Ice Volume

Snow Volume



Various set of data products are possible

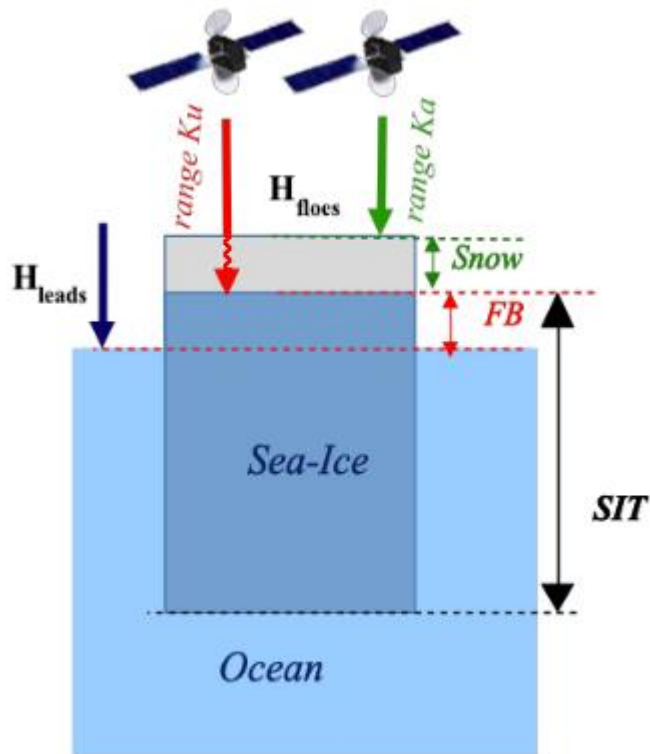


Thank you !

(In case there are questions)

Additional slides

Freeboard Radar definition



$$FB_{ice} = H_{ice} - H_{oce}$$

$$FB_{ice} = h_{ice} \cdot (1 - \rho_{ice}/\rho_{oce}) - h_{snow} \cdot \rho_{snow}/\rho_{oce}$$

$$FB_{Radar} = FB_{ice} - h_{snow} \cdot (c/c_{snow} - 1)$$

$$c_{snow} = c \cdot (1 + 0.51 \cdot \rho_{snow}/1000)^{-1.5} \text{ (from Ulaby, 1986)}$$

$$Radar\ FB = a(\rho_{ice}, \rho_{oce}, \rho_{snow}) \cdot h_{ice} + b(\rho_{ice}, \rho_{oce}, \rho_{snow}) h_{snow}$$

In NEMO3.6, we use

$$\rho_{oce} = 1026 \quad \rho_{ice} = 917 \quad \rho_{snow} = 330 \quad (\text{kg/m}^3)$$

$$\Rightarrow FB_{Radar} = 0.106 h_{ice} - 0.584 h_{snow}$$

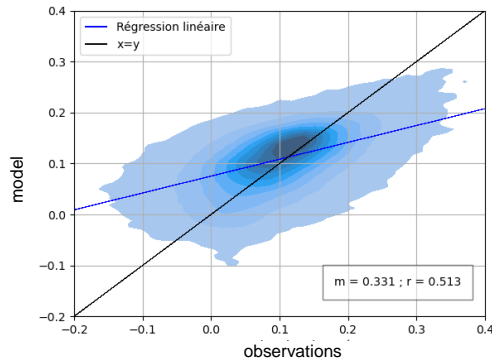
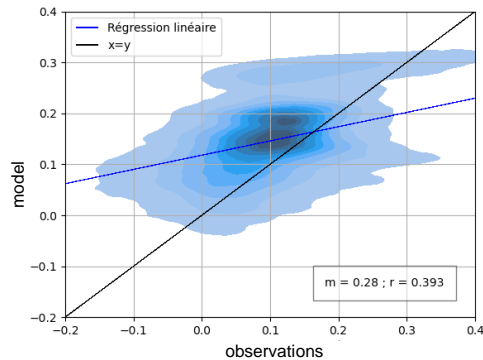
$$FBRVOLU = FBR.SIC = a.SIVOLU + b.SNVOLU$$

METHOD 1 : Assimilation of sea-ice volume

RESULTS

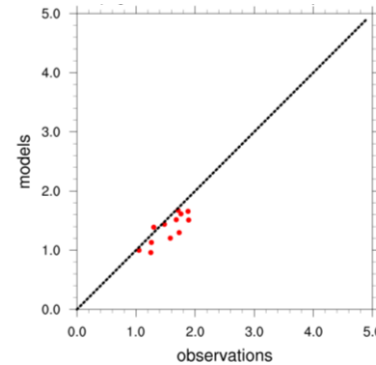
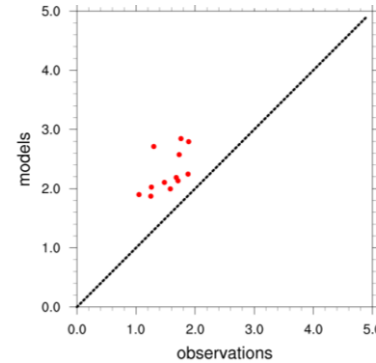
Comparison with assimilated datasets :

Radar freeboard [m]



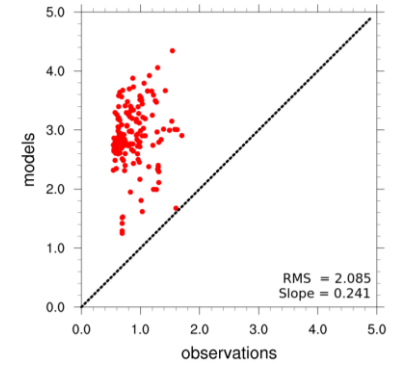
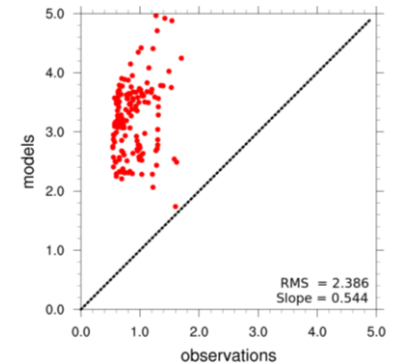
Comparison with independent datasets :

Beaufort Gyre
Exploration Project
Sea-ice draft [m]



Operation Ice Bridge

Sea-ice thickness [m]



**Without
assimilation**

**With
assimilation**

Multivariate and multidata sea-ice analysis ✓

Assimilation of along-track CryoSat-2 data ✓

Next developments of this study:

- Adaptation to the **new sea-ice NEMO model SI3**;
- Production of a short reanalysis 2011-2020 with assimilation in **Antarctica**;
- Implementation and tests of a Snow Volume data assimilation with altimetry bi-band **KaKu data** (Garnier et al. 2021).

