



**Barcelona  
Supercomputing  
Center**

*Centro Nacional de Supercomputación*

# Arctic research activities at BSC & On Arctic sea ice thickness clusters

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**Barcelona Supercomputing Center – Centro Nacional de Supercomputación (BSC-CNS)** is the premium HPC center in Spain located on **UPC** campus in Barcelona

More than 400 members (from more than 30 countries) are organized in 5 departments:

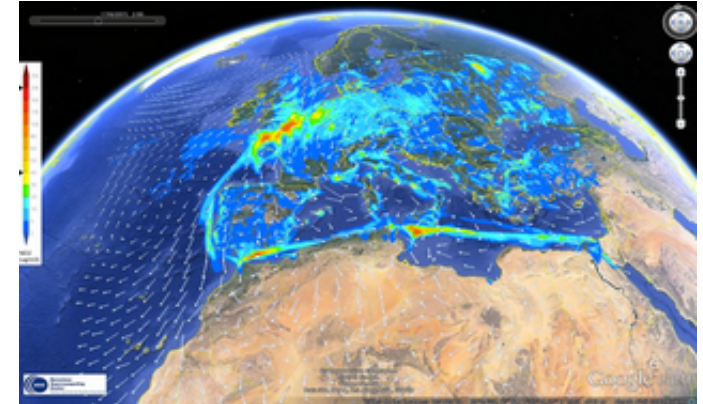
- Computer Sciences
- **Earth Sciences**
- Life Sciences
- Computer Applications
- Support and Services

**MareNostrum III** (housed in Torre Girona) is one of the most powerful supercomputers in Europe (48,128 processors with 1.1 Pflops peak performance) ➡ this year it will be replaced with **MareNostrum IV**



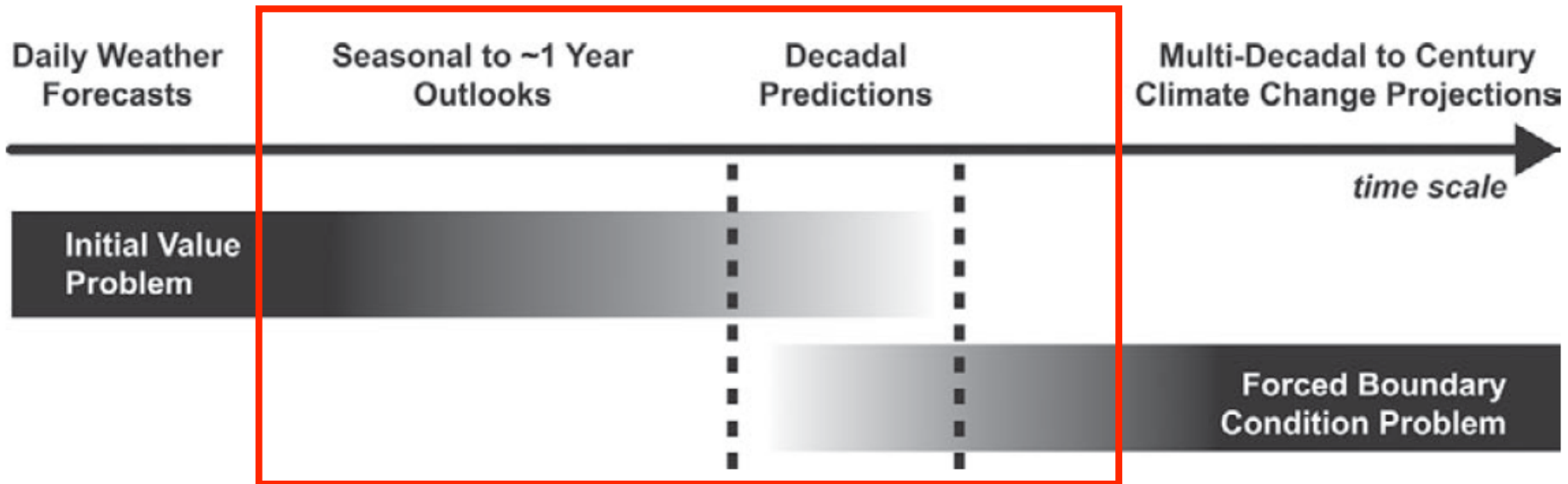
**Earth Sciences Department** → conduct research in **Earth System Modeling** and is structured in 4 groups:

- **Atmospheric Composition** → regional and global weather chemical predictions, air quality, dust emissions, ..
- **Climate Prediction** → regional and global climate predictions from sub-seasonal to multi-decadal timescales, climate analysis, ..
- **Earth System Services** → facilitate knowledge and technology transfer, via tailored services, between science and its end users, aim to maximize value of air quality and climate predictions to society, ..
- **Computational Earth Sciences** → support and development of software and IT infrastructure for Earth Sciences Department





Climate predictions group focuses on weekly to annual forecasts on subseasonal (<3 months), seasonal (3-6 months), interannual (multi-year) and multi-decadal times scales (up to 30 years ahead)



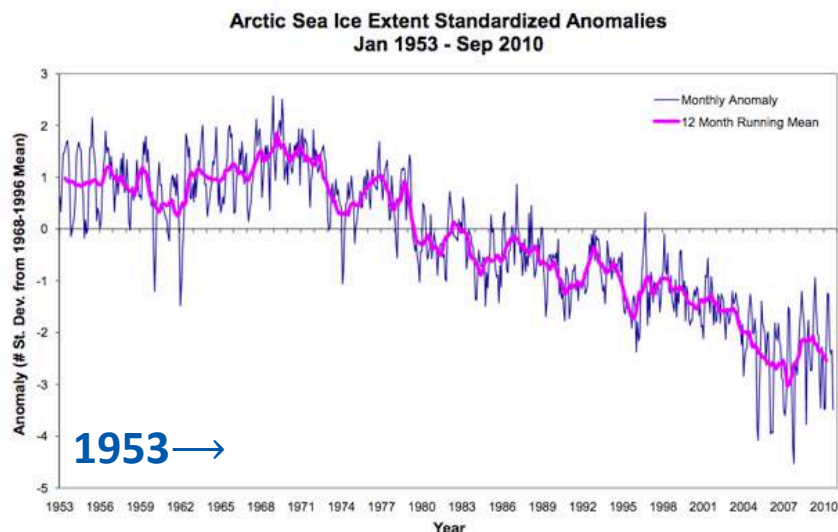
**Range where memory of the initial state (IC) and boundary forcing (BC) are both critical**



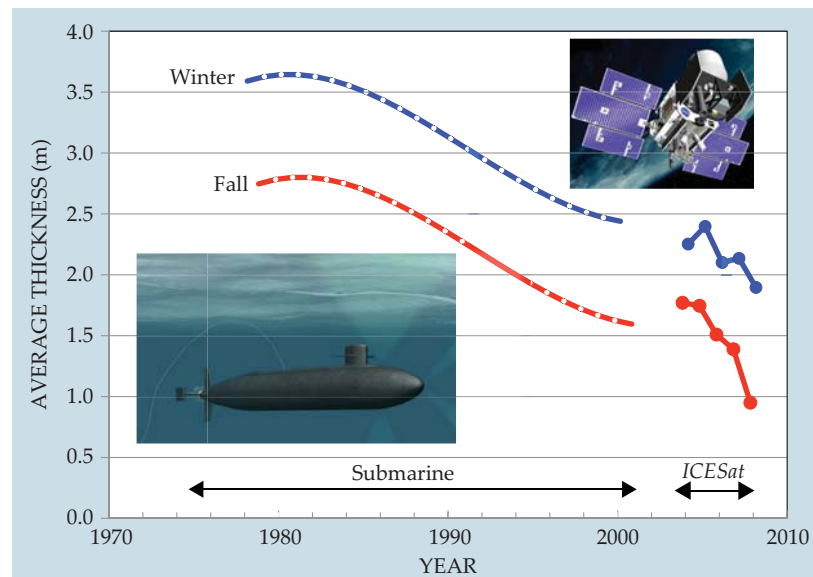


# Arctic variability and change

- NH sea ice cover has experienced a long-term decline superimposed on a strong internal variability → what is the impact on Arctic predictability?



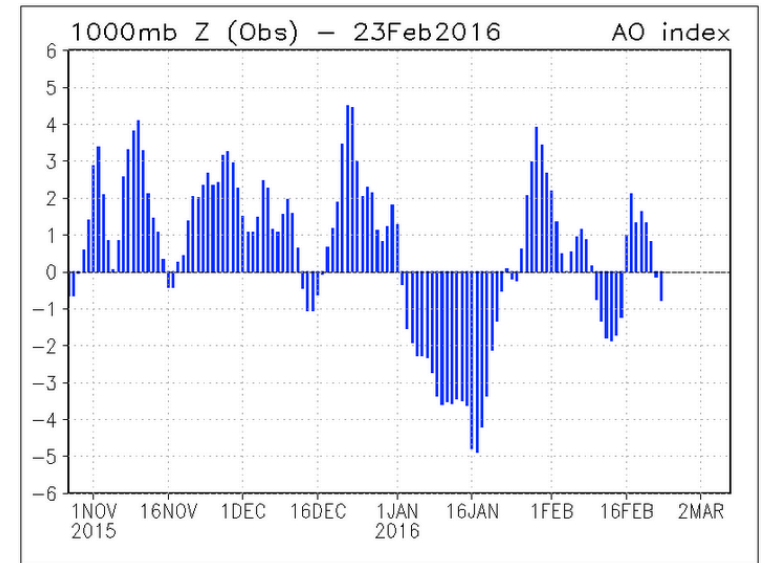
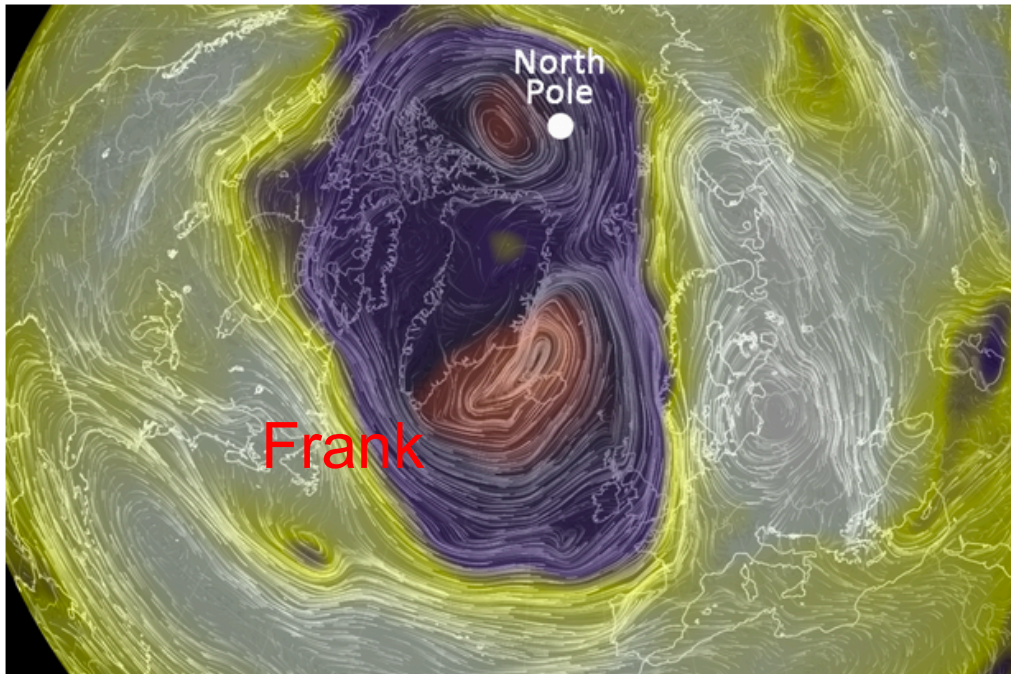
Sea ice charts of the Arctic Ocean show that ice extent has declined since at least the 1950s. Credit: NSIDC and the UK Hadley Center



- Key climate memory (IC=initial conditions) resides in the ocean (SST, ML heat content, ...), sea ice – critical on subseasonal to interannual timescale (sea ice concentration, SIC, and thickness, SIT, ..) and land surface (snow cover, soil moisture, ..)



From Arctic perspective we certainly live in “interesting times”



NCEP/NOAA

≈ 30 Dec, 2015



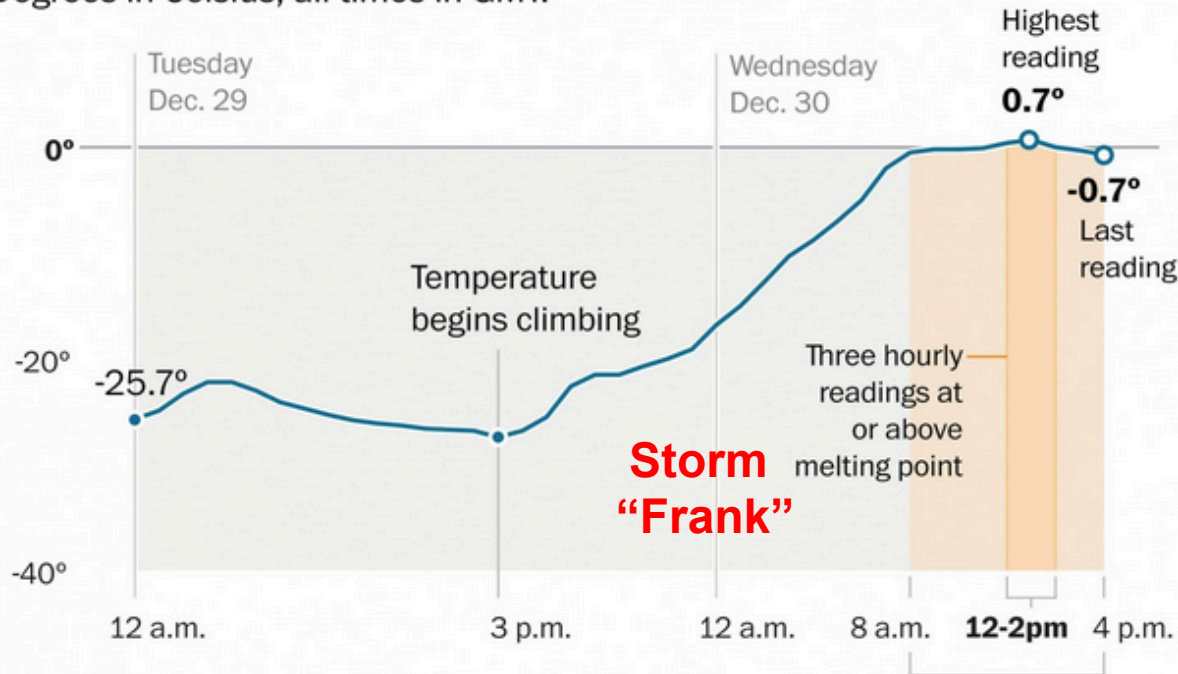


# Recent Arctic highlights

## → short-term variability

### Temperature near North Pole warms above freezing mark

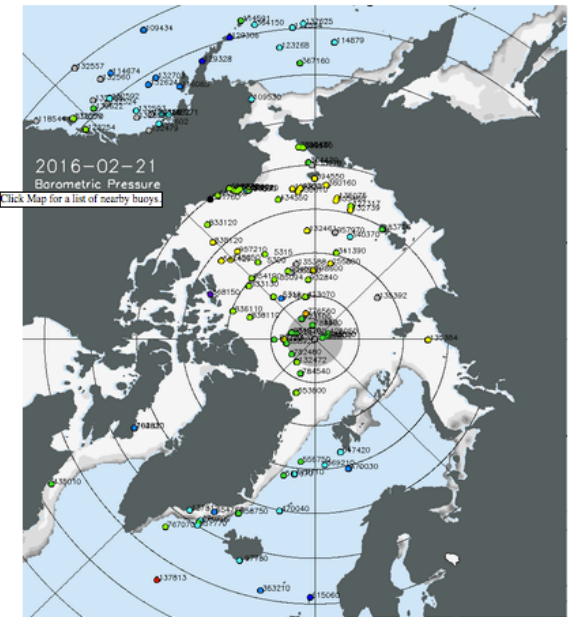
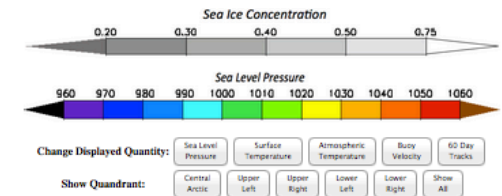
Hourly air temperature readings from Buoy #6400476.  
Degrees in Celsius, all times in GMT.



Note: Buoy stopped reporting data after 4 p.m.

Nine hourly readings within one degree of melting point

## International Arctic Buoy Program iabp.apl.washington.edu

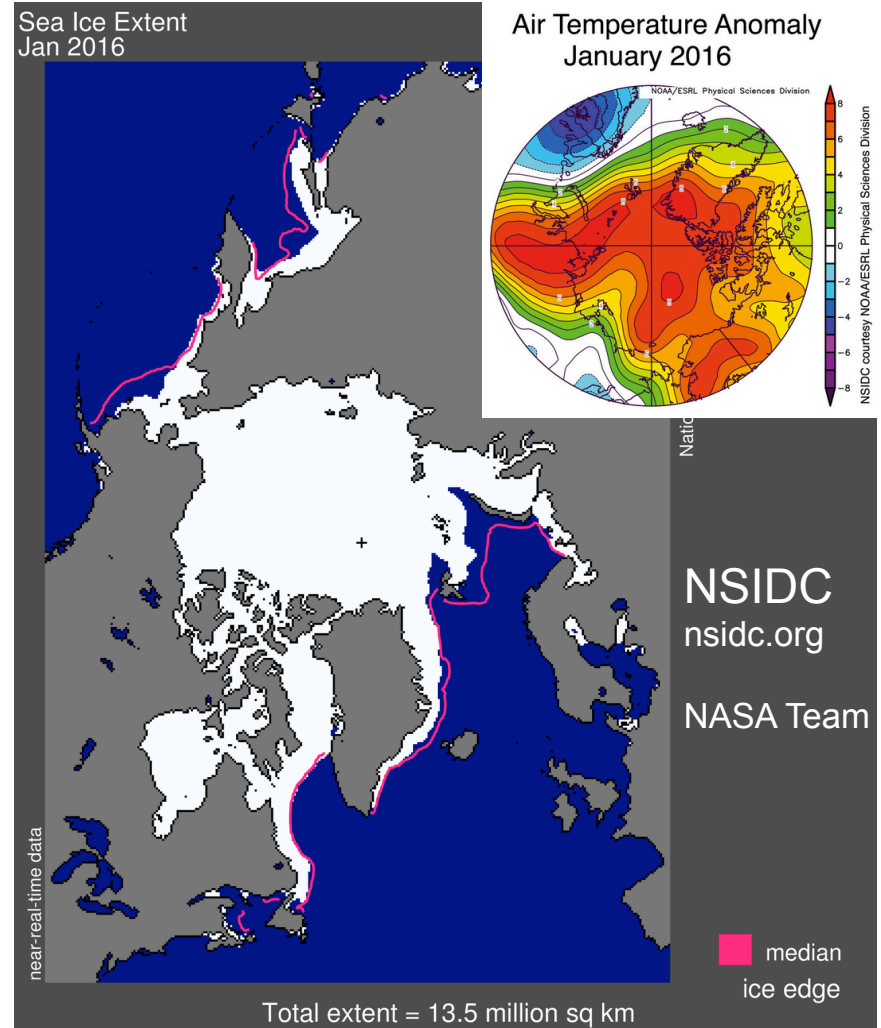
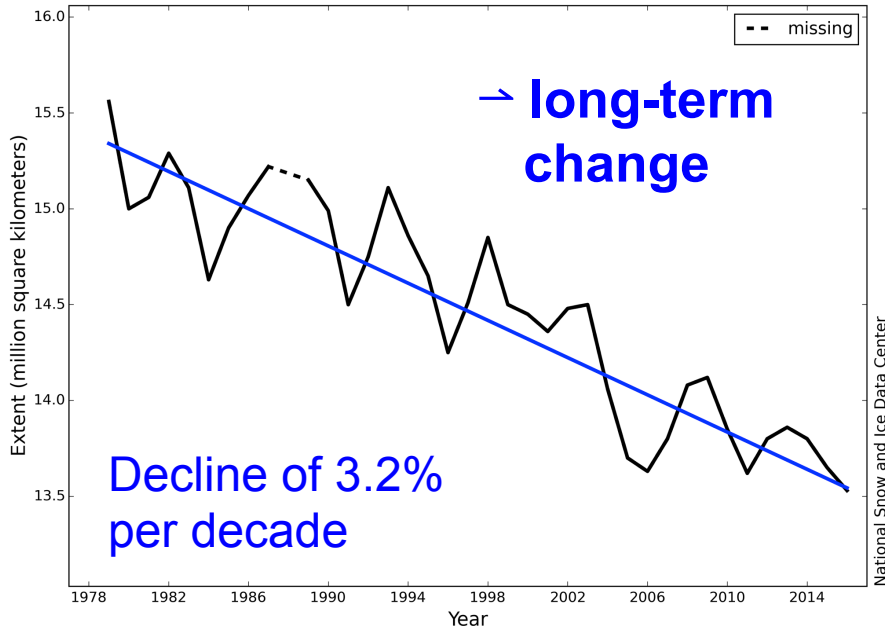


# Recent Arctic highlights

- **The lowest NH January SIE in the satellite record (since 1979)**

- unusually high SAT
- persistent negative AO phase

Average Monthly Arctic Sea Ice Extent  
January 1979 - 2016





- **Sea ice ESM reconstruction and initialization**

Quality of climate forecast depends on development of a model (numerical methods and **inclusion of expanding set of physical and biogeochemical processes**) and the associated **data assimilation routine for production of different observationally based IC**

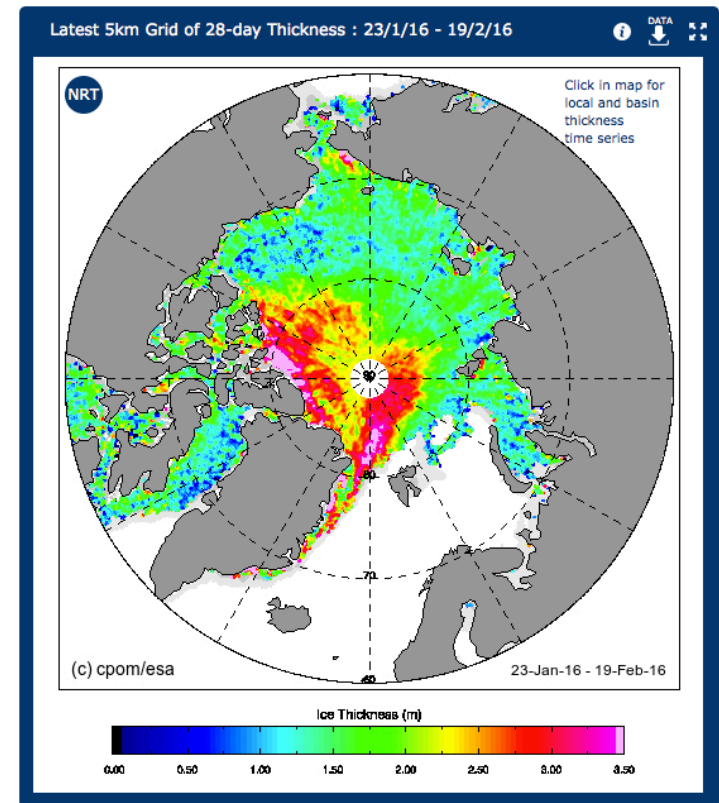
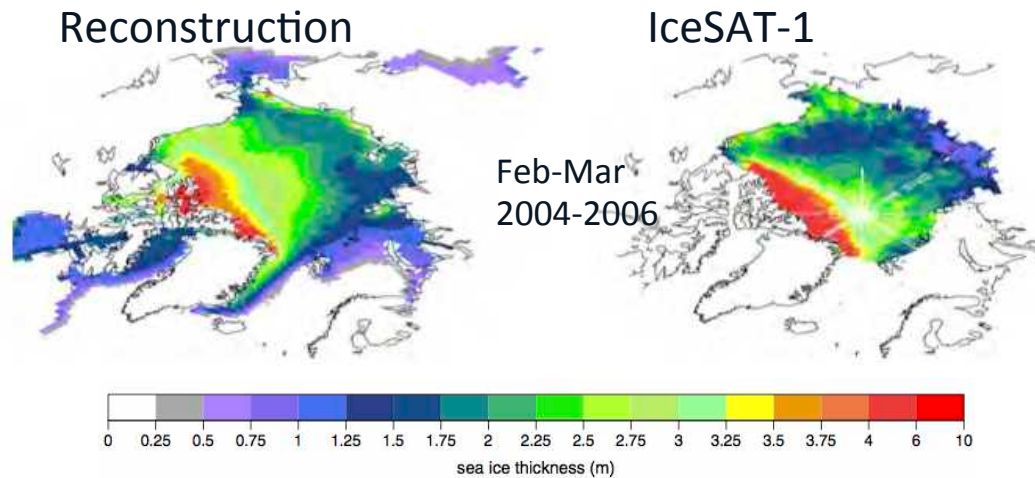
→ **SIT** is likely a key medium for the sea ice system memory on longer time scales



Measuring **SIT** is a demanding task at any scale  $\Rightarrow$  use **reconstruction = GCM + data assimilation**

For example: multi-member NEMO3.2-LIM2 reconstructions (surface forcings: DFS4.3 and ERA-Int, and ocean restoring/nudging: ORAS4) utilized to get continuous **SIT** from 1958 to 2013

CryoSat-2





## Sea ice initial conditions for EC-Earth climate predictions

Source: GLORYS2v1, ORAP5, ... Reanalysis

\* interpolation and extrapolation to different grids (resolutions)

Source: BSC reconstructions

LIM2:

\* **ORCA1** : 5-member sea ice reconstructions obtained by running NEMO-LIM2 nudged toward ORAS4 monthly-mean 3D T and S and forced by

1. DFS4.3 over the 1958-2006 period = **b02s**
2. ERA-interim over the 1979-2013 period = **i00v**

LIM3 – 1 category:

\* **ORCA1** : 5-member sea ice reconstructions obtained by running NEMO-LIM3 nudged toward ORAS4 monthly-mean 3D T and S and forced by

1. DFS4.3 over the 1958-2006 period = **i056**
2. ERA-interim over the 1979-2013 period = **i057**

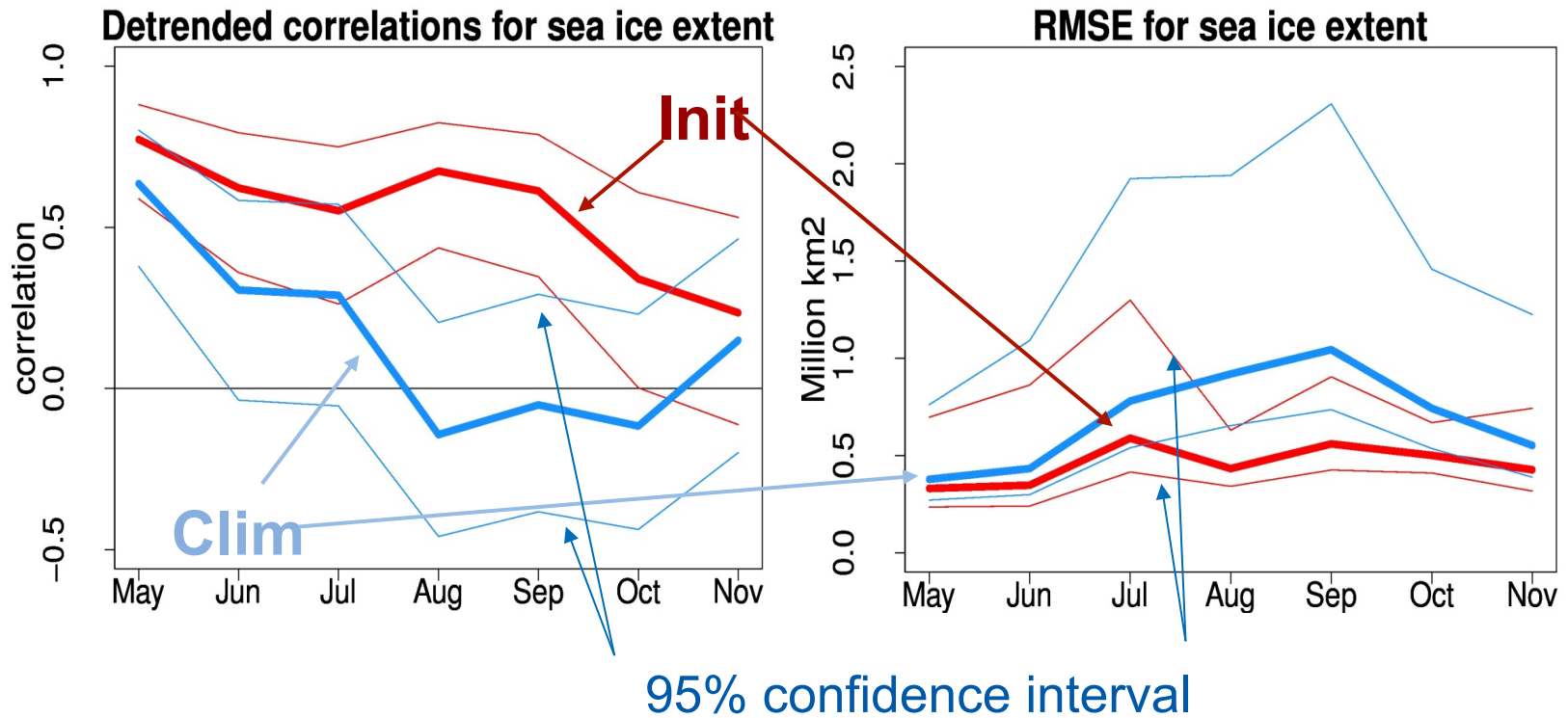
LIM3 – 5 category:

\* **ORCA1 and ORCA025 ... → data available to community and stakeholders**

More information : [https://dev.ec-earth.org/projects/eearth3/wiki/Sea\\_ice\\_initial\\_conditions\\_for\\_climate\\_predictions](https://dev.ec-earth.org/projects/eearth3/wiki/Sea_ice_initial_conditions_for_climate_predictions)



- Arctic ESM predictions from May 1st start dates

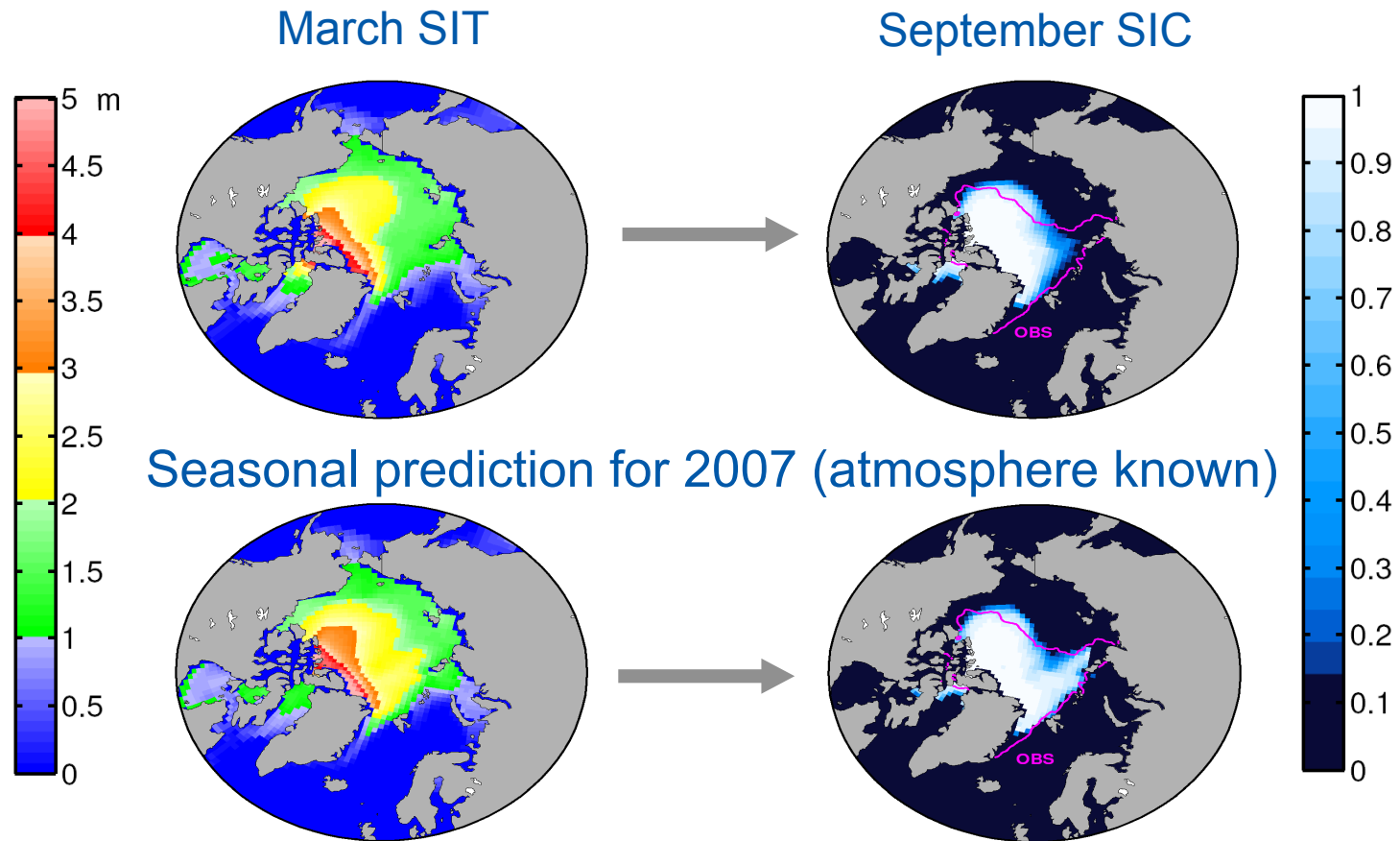


➡ **Skill increases with sea ice initialisation using nudging method (not due to the long-term trend)**





- The ensemble Kalman filter (EnKF): a multivariate data assimilation method for smoother initialization



$$F \downarrow_{air/ice} + F \downarrow_{ocean/ice} + F \downarrow_{ice/ice} \approx 0$$

$C_a$

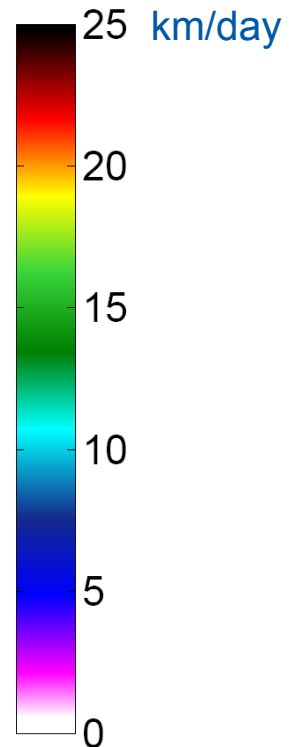
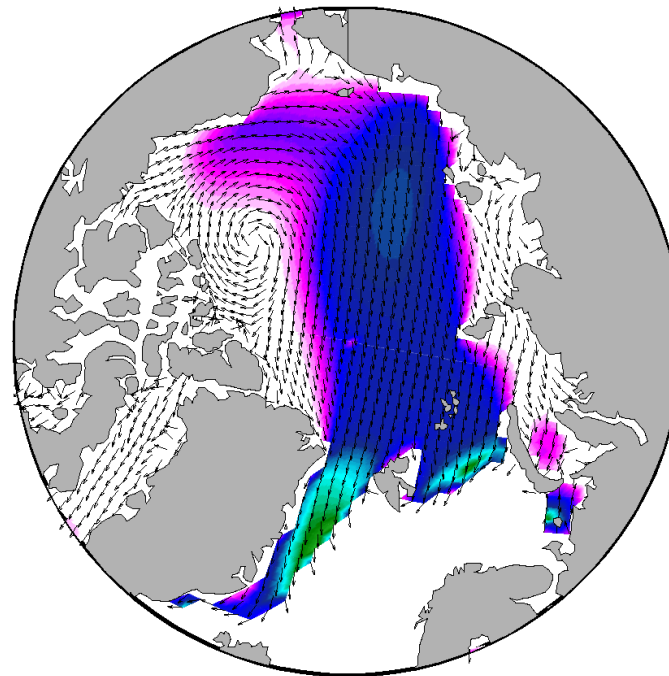
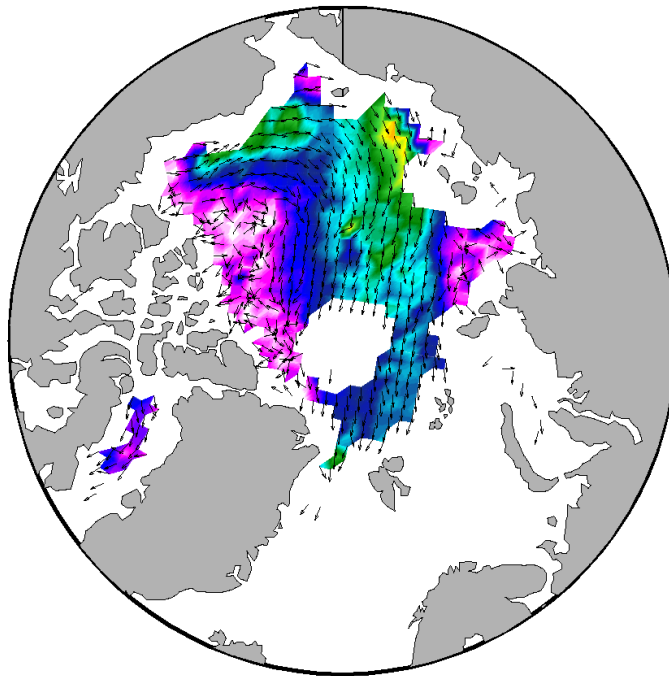
Sea ice drift (observed)

$C_w$

Sea ice drift (model)

$P^*$

- Parameter calibration via EnKF





$$F \downarrow_{air/ice} + F \downarrow_{ocean/ice} + F \downarrow_{ice/ice} \approx 0$$

$C_a$

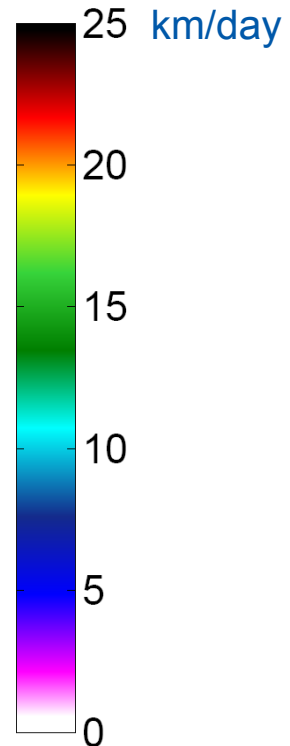
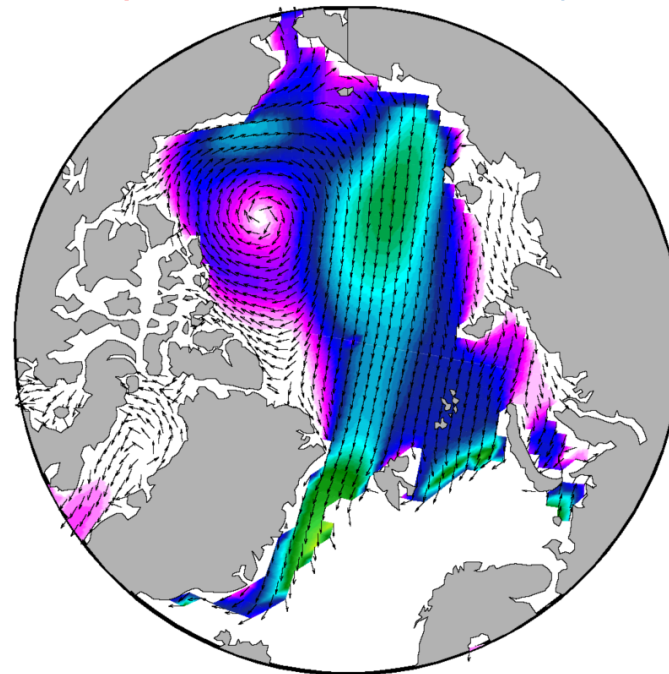
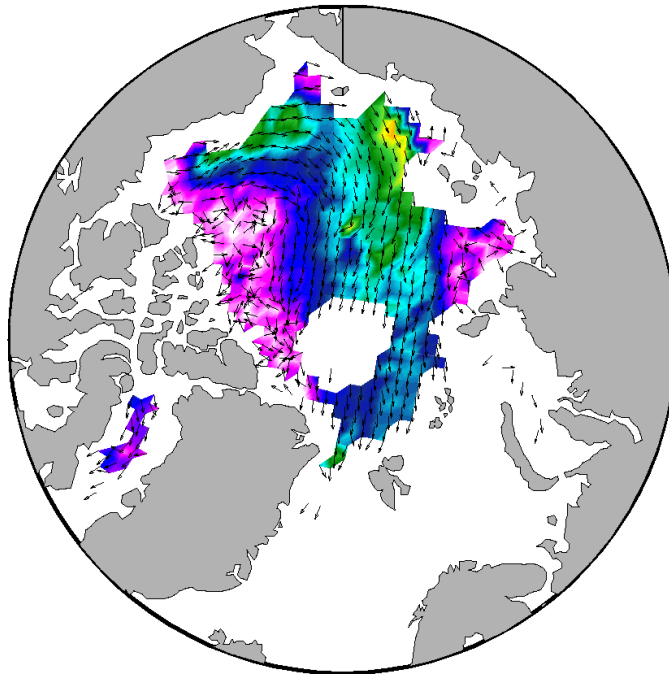
Sea ice drift (observed)

$C_w$

$P^*$

Sea ice drift (model,  
parameters calibrated)

- Parameter calibration via EnKF



# SIT K-means cluster analysis

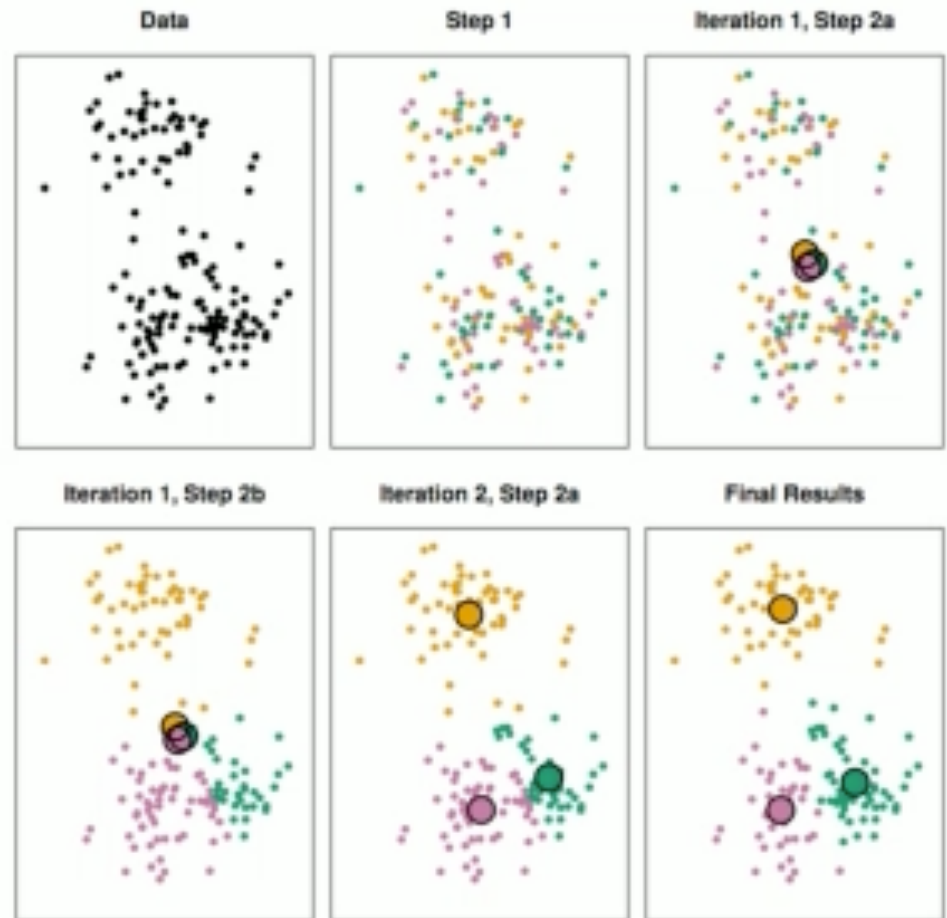
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**K-means method** is a clustering analysis that simultaneously minimize the distance between members of a given cluster and maximize the distance between the centers of the clusters

- **optimal number of clusters K** (typically determined via hierarchical clustering) **has to be specified in advance**
- **produces** representation of the spatial and temporal variability with **K patterns of cluster centers and time series of cluster occurrences**

E.g. iterative procedure for  $K=3$  with data  $(x_1, x_2, t)$





# SIT cluster centers & SIC comp.

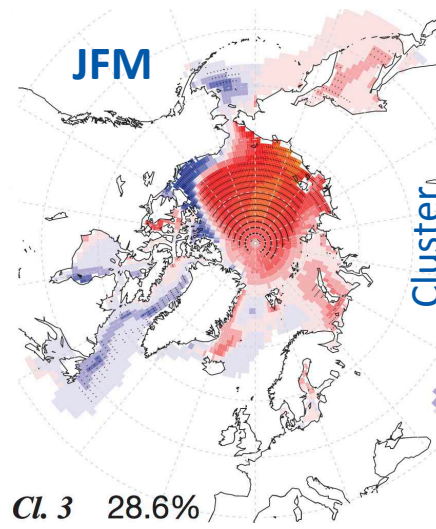
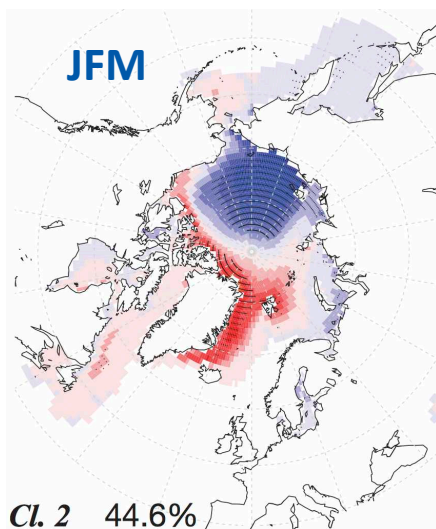
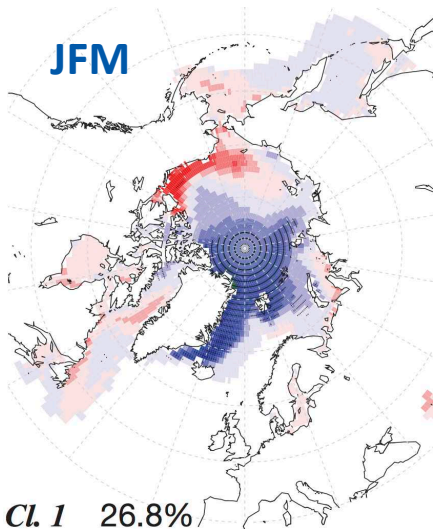
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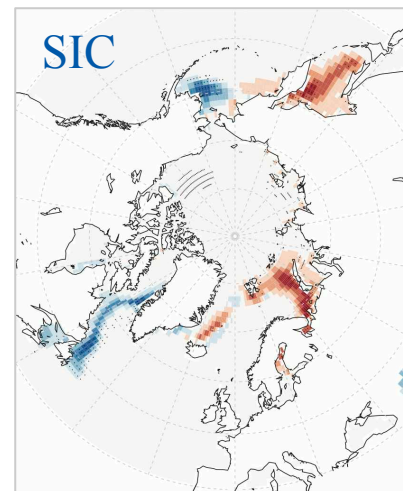
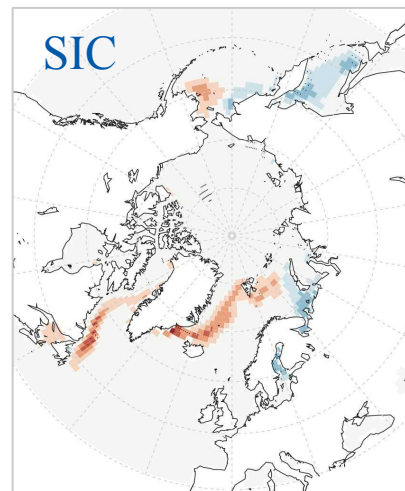
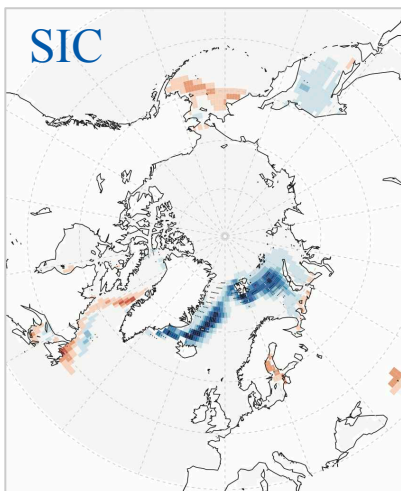
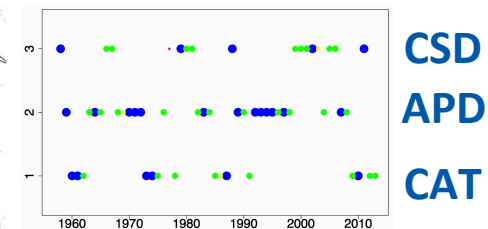
CAT mode

APD mode

CSD mode



JFM SIT(Ar) - r2



**CAT mode = Central Arctic Thinning mode**

**APD mode = Atlantic Pacific Dipole mode**

**CSD mode = Candian Siberian Diploe mode**

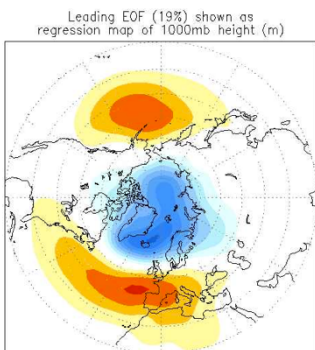
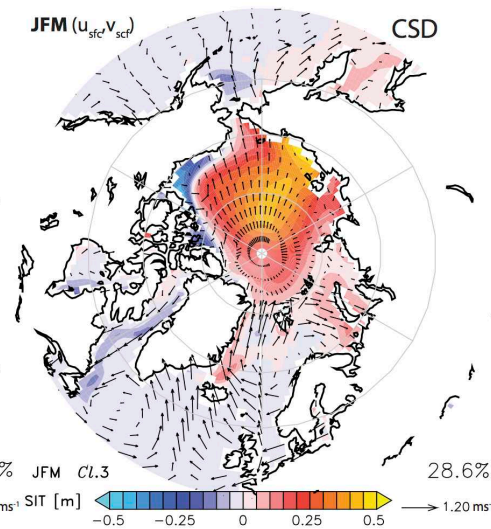
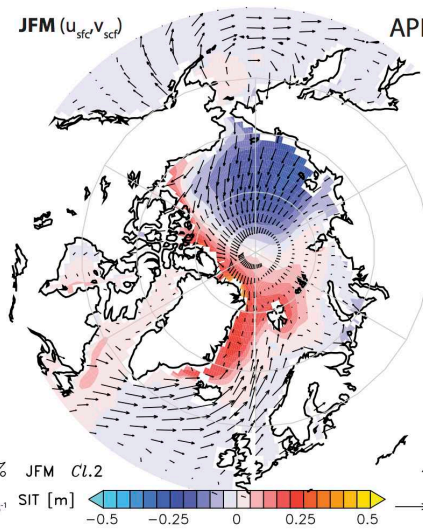
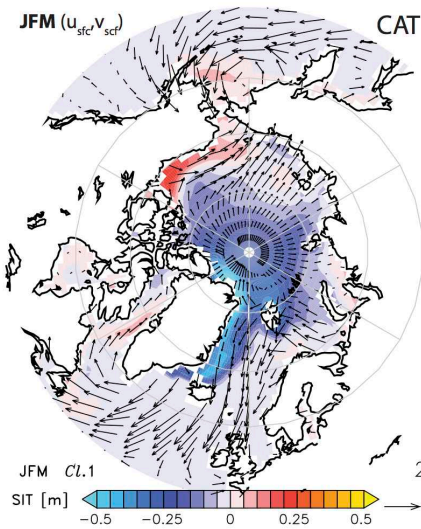
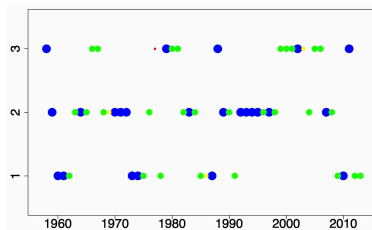




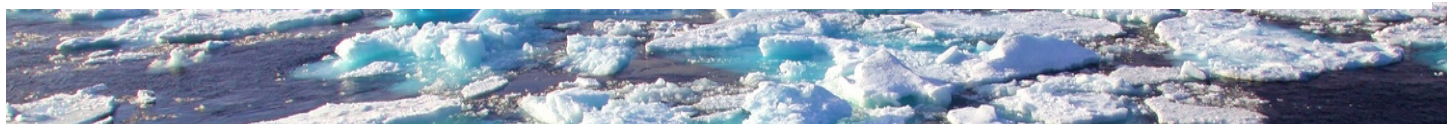
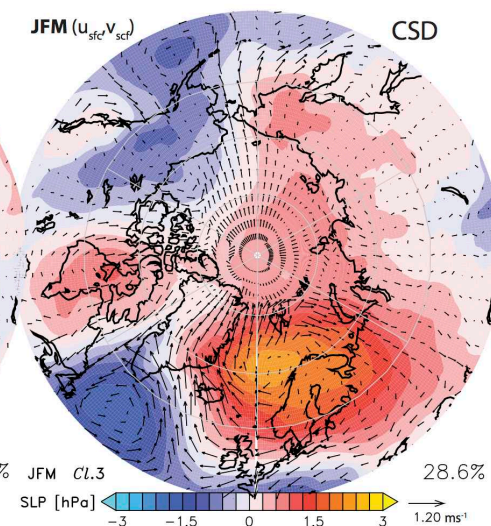
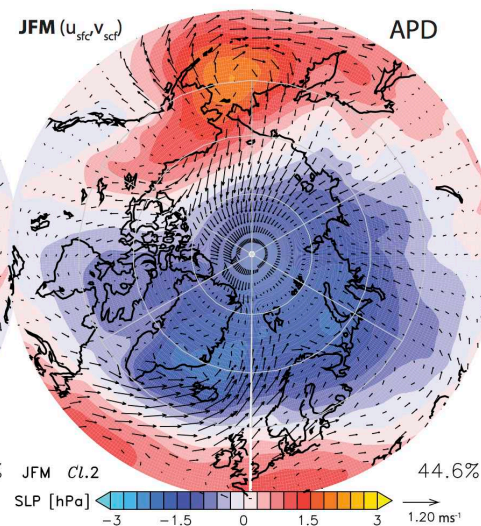
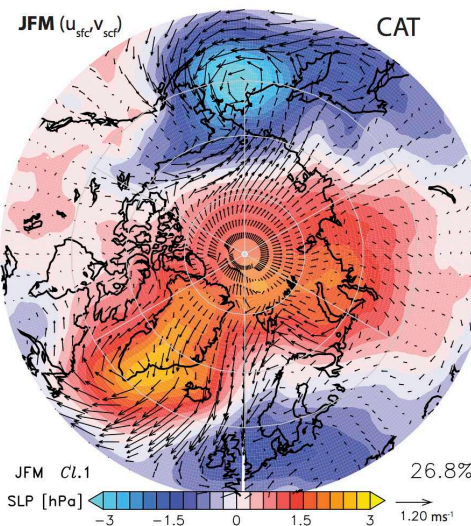
# Key influence of surface winds



## JFM SIT<sup>(Ar)</sup> - r2

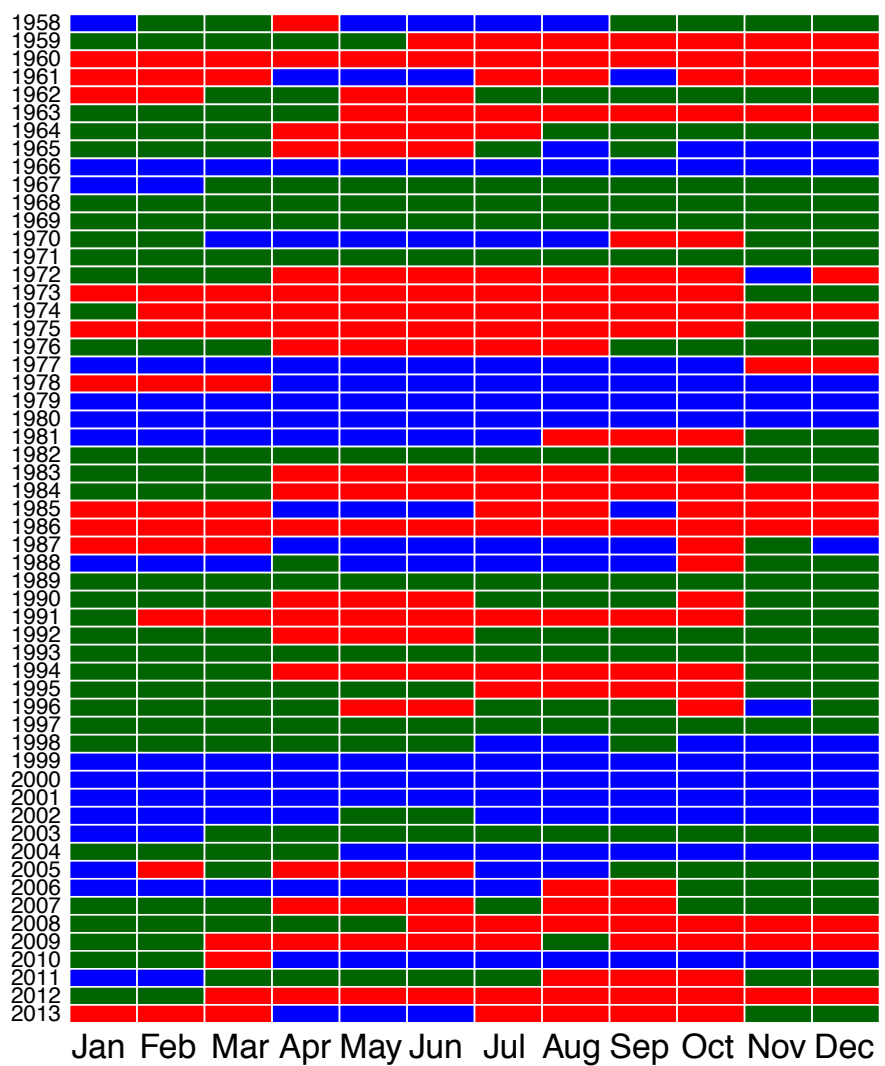


## NAM/AO





# Persistence of SIT clusters



CSD  
Cl. 3  
APD  
Cl. 2  
CAT  
Cl. 1

→ 3 identified SIT clusters (CAT, APD and CSD) often show persistence reaching into interannual time scales

← monthly SIT cluster occurrences

X(t+1)	CAT	APD	CSD
P{ X(t+1)   CAT(t) }	81.36%	13.18%	5.45%
P{ X(t+1)   APD(t) }	10.69%	85.12%	4.20%
P{ X(t+1)   CSD(t) }	6.87%	5.82%	87.30%

Conditional probability of the transition between Arctic SIT clusters (1958-2013)



## Seamless Earth-System Model

→ aims to forge weather and climate forecasting, and climate change studies in a single framework

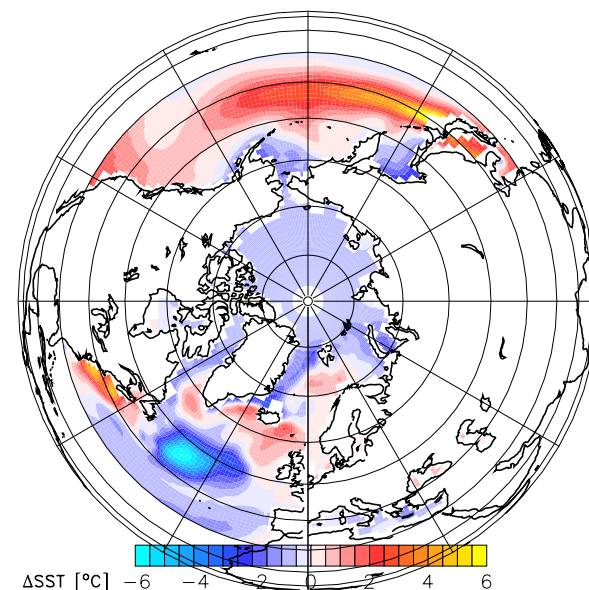
**Atmosphere:** ECMWF's Integrated Forecasting System (IFS) T159 and L62 (up to 5 hPa)

**Land:** H-TESEL (part of IFS)

**Ocean:** Nucleus for European Modeling of the Ocean (NEMO) v3.2 in ORCA1L42

**Sea ice:** Louvain-la-Neuve sea Ice Model (LIM) V2 (part of NEMO)

→ 5-member seasonal (12-month) prediction using full-field initialization (using ERA-Interim for atmospheric IC, ORAS4 for oceanic IC and sea ice IC from reconstruction used to identify SIT clusters) with **May 1<sup>st</sup>** and **November 1<sup>st</sup>** start dates from **1979 to 2010**

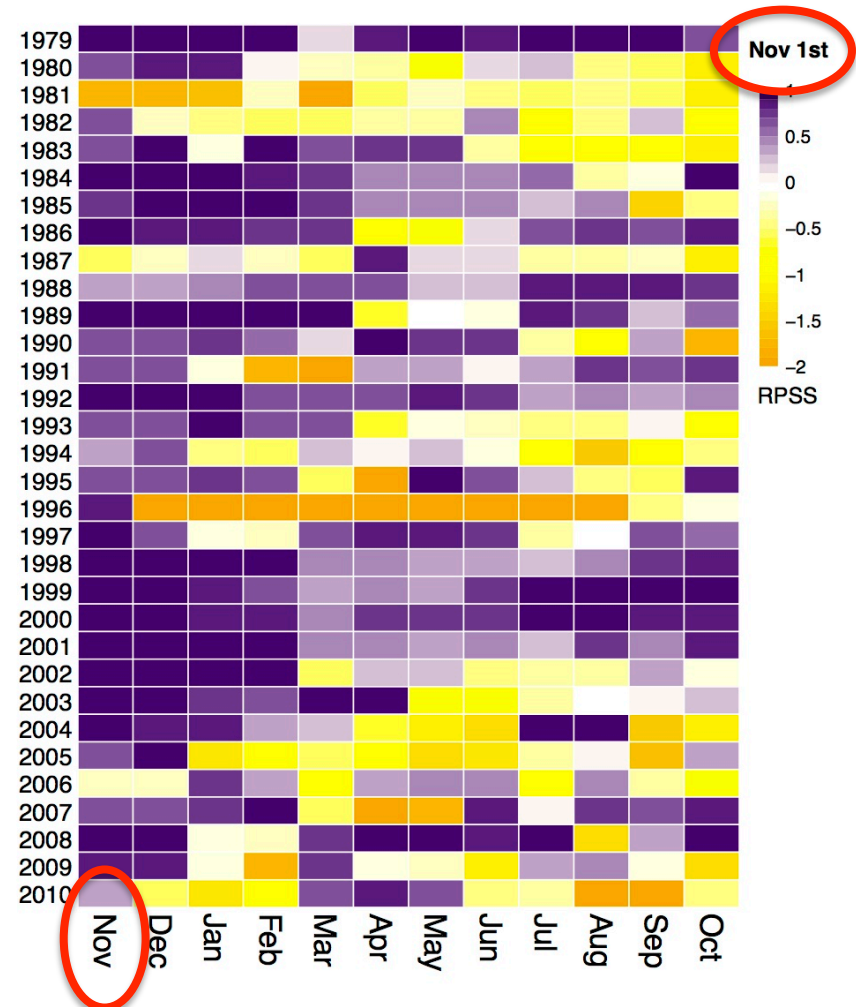
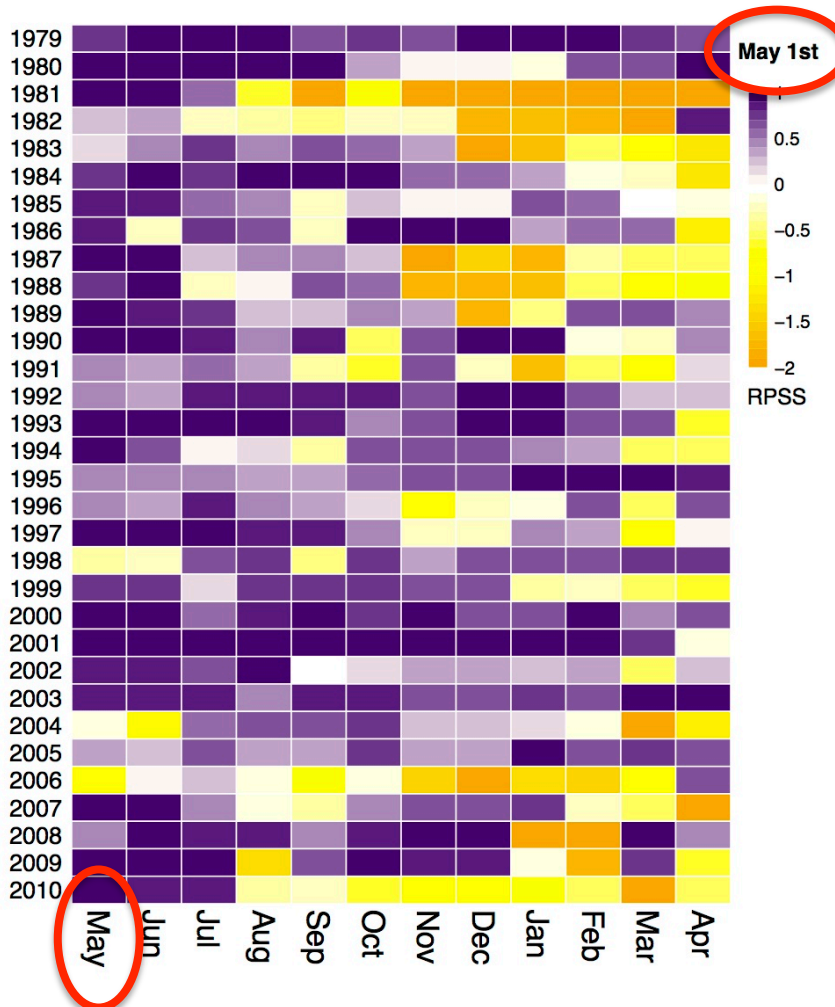


EC-Earth2.3 <1979-2012>  
- ERSSTv3b <1979-2012>

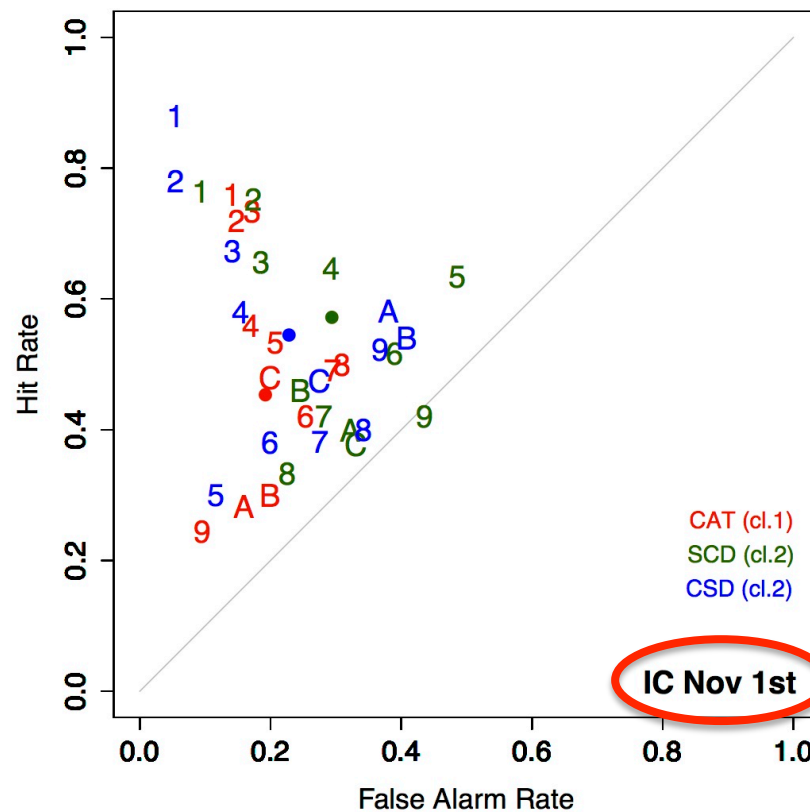
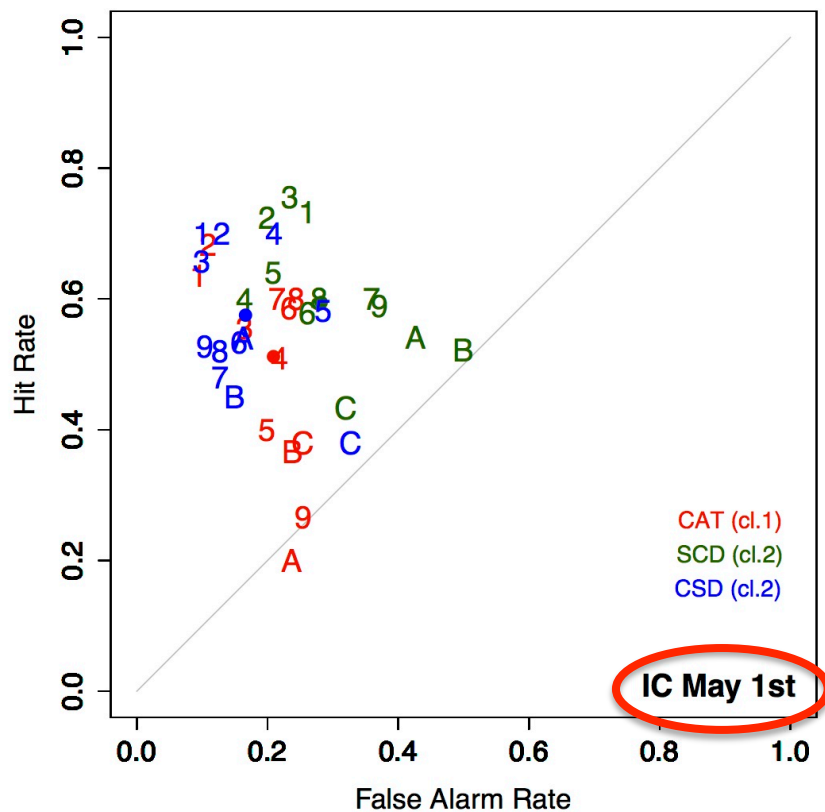




## Rank Probability Skill Score (ref. forecast: 1<sup>st</sup> order Markov chain)



# ROC diagrams of SIT clusters



→ EC-Earth2.3 SIT cluster predictions initialized in summer (May 1<sup>st</sup>) show initially lower skill that predictions initialized in winter (Nov 1<sup>st</sup>), but prediction skill in summer is deteriorated at slower rate than in winter



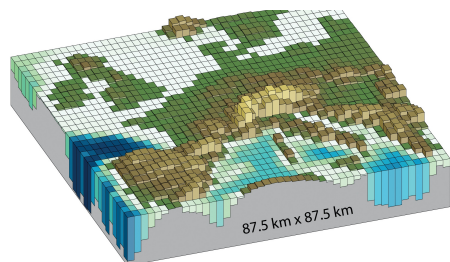
- **Research on initialisation:** generate a set of initial conditions (for ocean and **sea ice**) and compare different initialisation techniques (e.g. full field versus anomaly initialisation)
- **Improving model processes:** Inclusion and/or testing of model components (biogeochemistry, vegetation, aerosols, **sea ice**) or new parameterizations, model parameter calibration, increase in resolution
- **Bias correction, calibration and combination:** *hierarchy of post-processing methods and empirical predictions* (better use of current benchmarks)
- **Forecast quality assessment:** *provide skill scores practical to the user, reliability as a main target, process-based verification, attribution of climate events with successful predictions*, diagnostics of model fidelity including both strengths and weaknesses
- **More sensitivity to the users' needs:** going beyond downscaling, better documentation, *demonstration of value and outreach* → *building versatile climate services for stakeholders* as a part of Earth system services



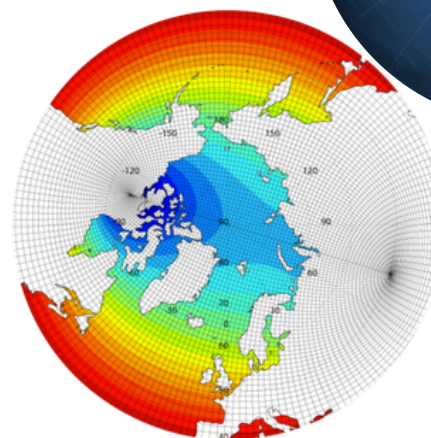
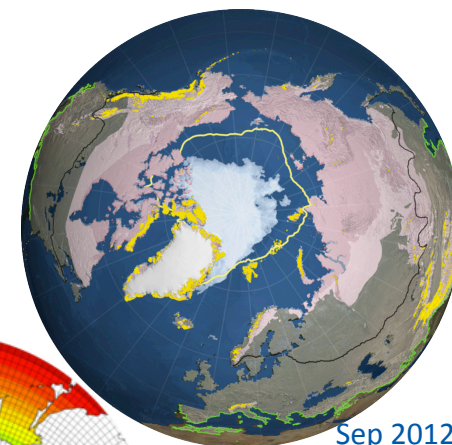


# Thank you for your attention

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*Merci pour votre attention*  
*Bedankt voor uw aandacht*  
*Danke für Ihre Aufmerksamkeit*



- Sea Ice
- Glaciers
- Ice Sheet
- Ice Shelves
- Continuous Permafrost
- Discontinuous Permafrost
- Sea Ice 30 Yr Ave Extent
- 50% Snow Extent Line
- Max Snow Extent Line

