



Arctic MFC  
marine.copernicus.eu



# Arctic sea ice (and icebergs) in a changing climate

*L. Bertino, Nansen Center  
with contributions from colleagues P. Rampal, J. Xie ...*



# Assignment

- **How has our understanding of changes and model projections evolved since 2008?**
- **What is current best practise, including the most appropriate models, downscaling approaches and analysis techniques?**
- **Is current practice at a state where it can be relied upon for long-term business decisions?**
- **What are the recognised gaps and uncertainties in current practise**
- **and what needs to be done to close these gaps and address the uncertainties?**

# State of knowledge as of 2008

## 2007 was the “then-record” sea ice minimum

Anxiety about abrupt sea ice loss.

Many lower records since then. Many more to come...

## Loss of multi-year ice

Still valid

## Sea ice drift acceleration was yet unknown

Rampal et al. 2009.

## Sea ice thickness only observed twice a year by ICESat

SMOS, CryoSAT2, Sentinel3, soon ICESat2. But ONLY IN WINTER.

Knowledge of ice volume still uncertain

## Storminess and waves expected to increase

Still valid, higher and longer waves but less steep.

## Ocean warmth intrusion in the Arctic

“Atlantification” of the Arctic, Polyakov et al. 2011, but no warm water intrusions since then.

Positive feedback in Barents Sea due to the loss of ice (Lind et al. 2018)

## More icebergs

Still unsure

## Acidification

Still valid

## Resilience of the ecosystem (lack thereof)?

Still debated

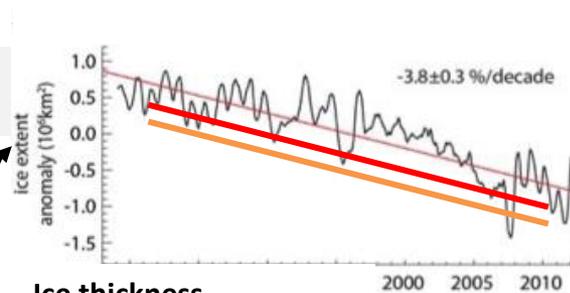
# Known trends in the Arctic sea ice

Smaller

Thinner

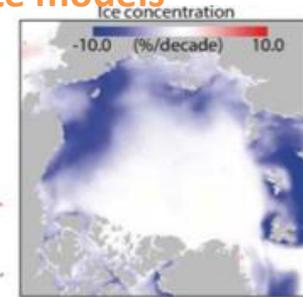
Faster

## Ice extent

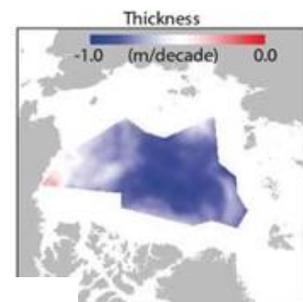
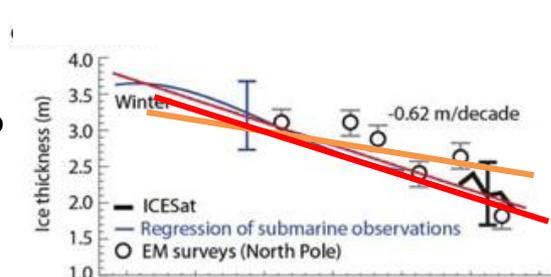


Observations

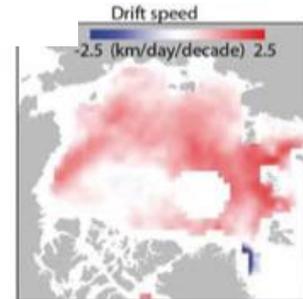
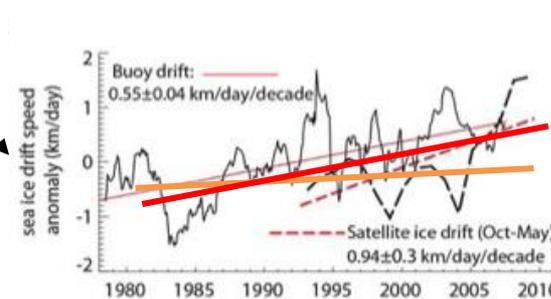
Climate models



## Ice thickness

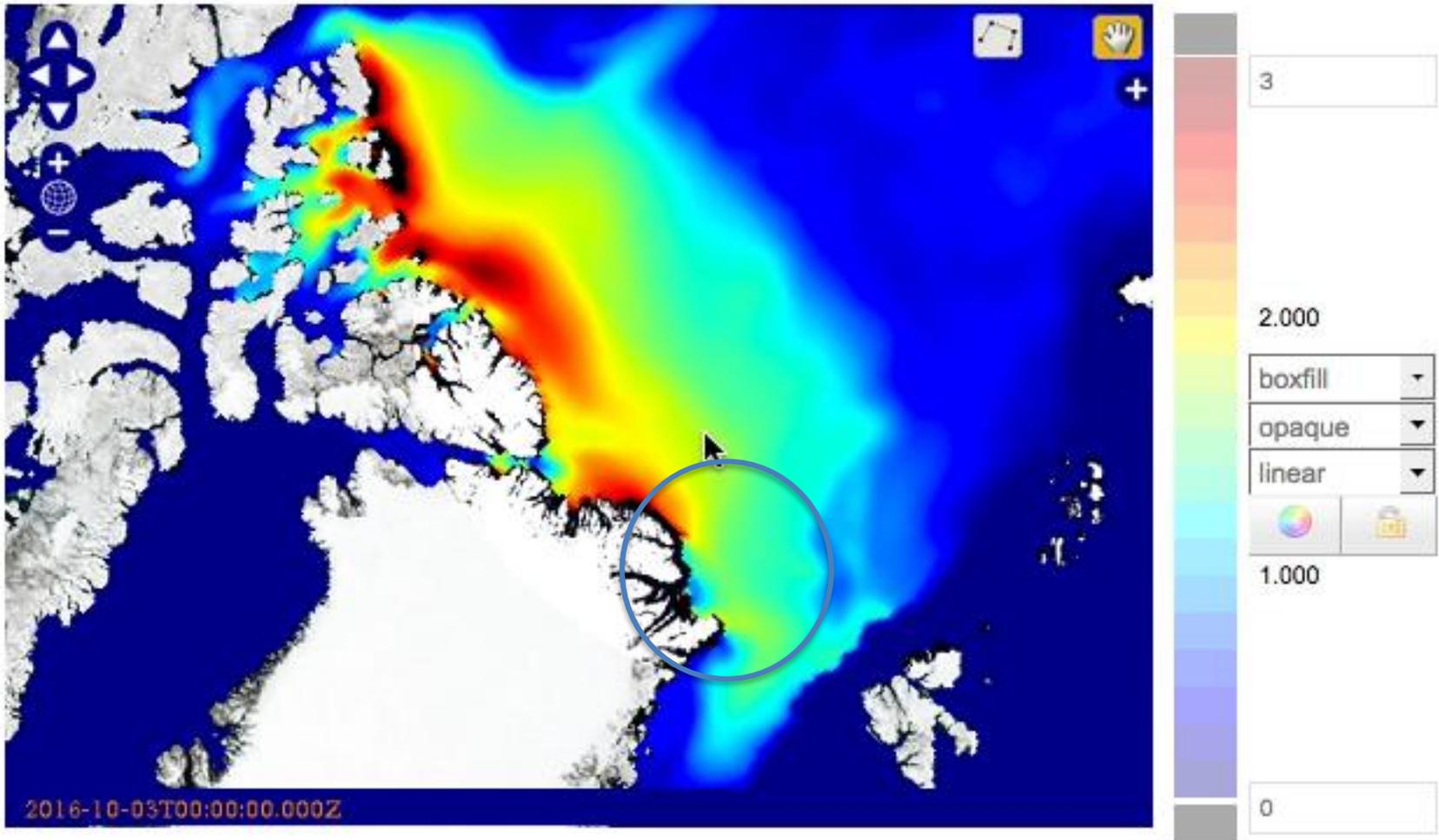


## Ice drift and deformation



From IPCC report, 2013

# Present situation 2016 - 2018



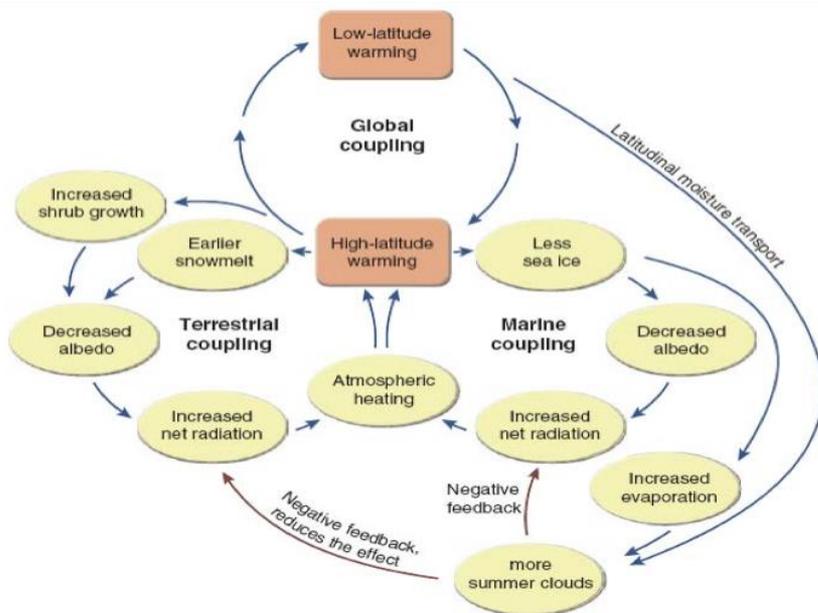
From <http://marine.copenicus.eu>  
Note the polynyas in Feb 2018 and Aug. 2018

# Arctic amplification

As of 2008

Albedo feedback (positive)  
Cloud feedback (negative)

Chapin III et al. 2005



As of 2018

Temperature feedbacks  
Albedo feedbacks (ice + snow)

Pithan & Mauritsen (Nat. 2014),  
Based on models only, but

- mis-represented feedbacks (known unknowns)
- unexpected feedbacks... (unknown unknowns)

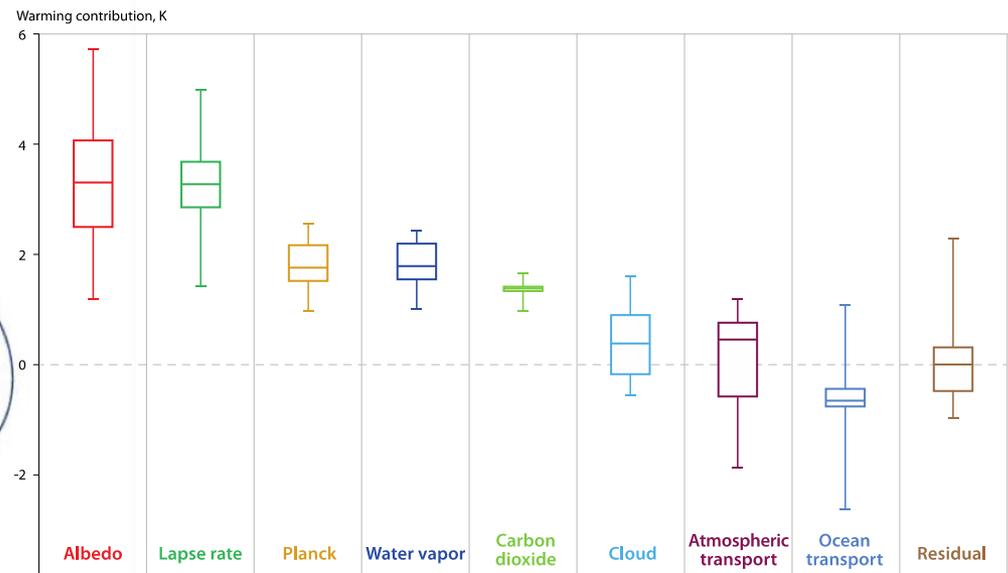
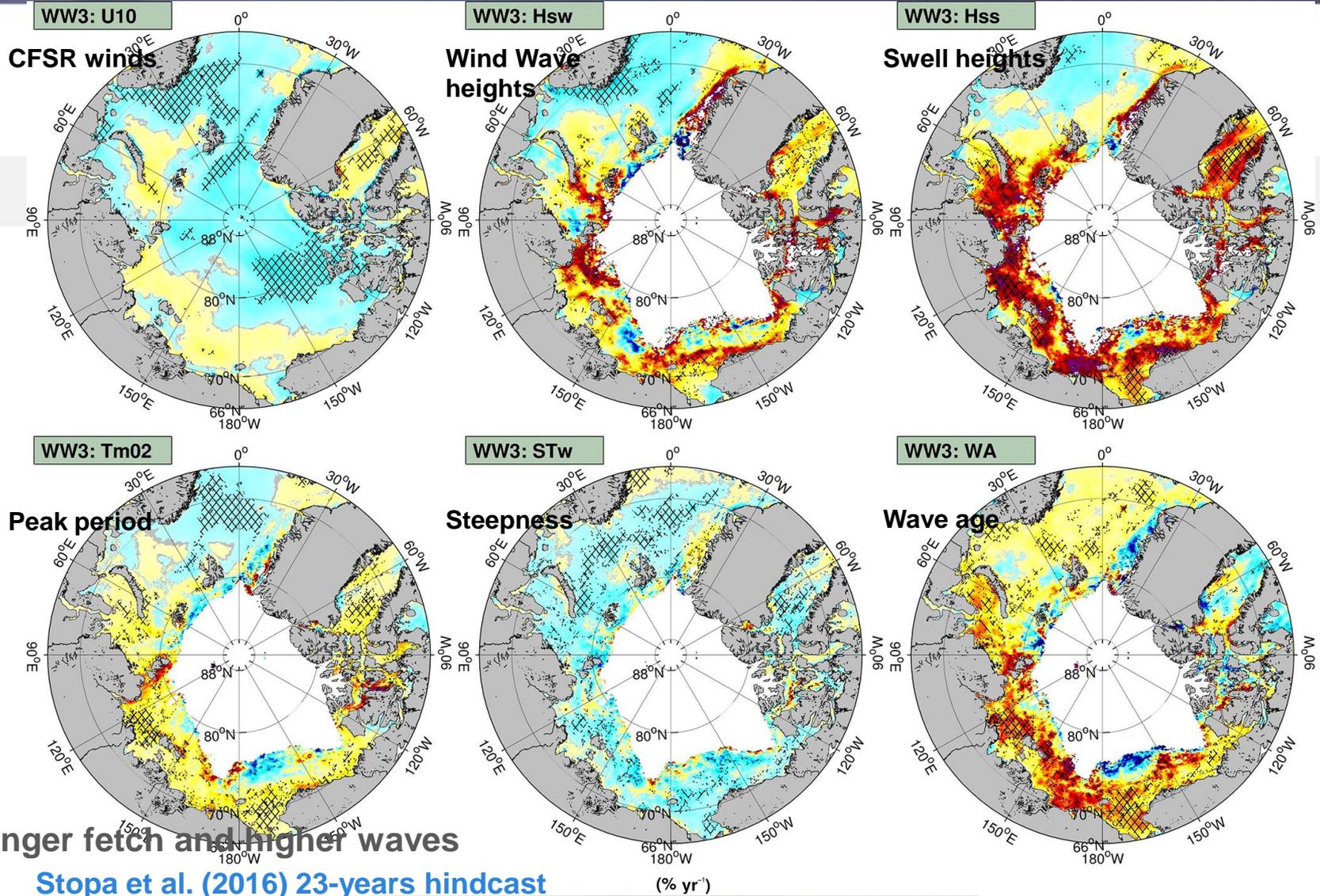


Figure 2.10 Contributions of various feedbacks to total Arctic warming in CMIP5 global climate models (Pithan and Mauritsen, 2014).

# Changing wave climate in the Arctic



Longer fetch and higher waves

Stopa et al. (2016) 23-years hindcast

Coastal erosion confirmed

02/10/2018 Name of the event, Place

# Enhanced mixing in the Arctic Ocean

## Rippeth et al. 2015:

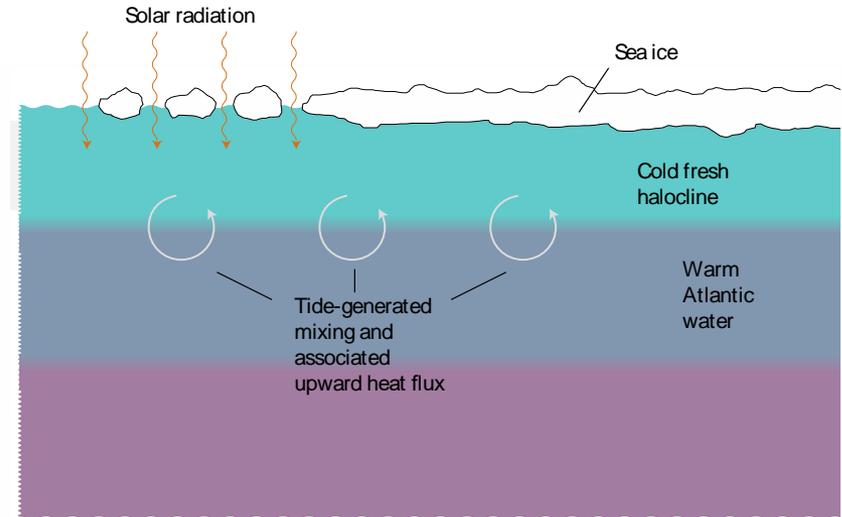
- Upward mixing of heat independent of sea ice
- Associated with tidal mixing

## Lind et al. Nature 2018

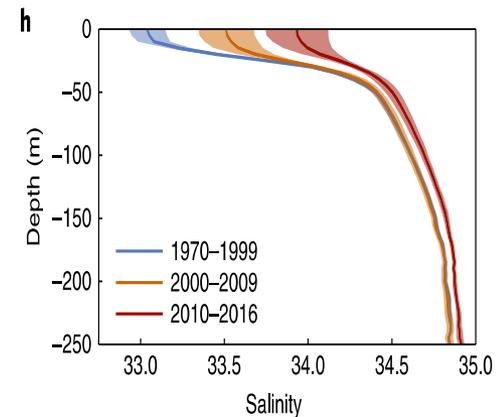
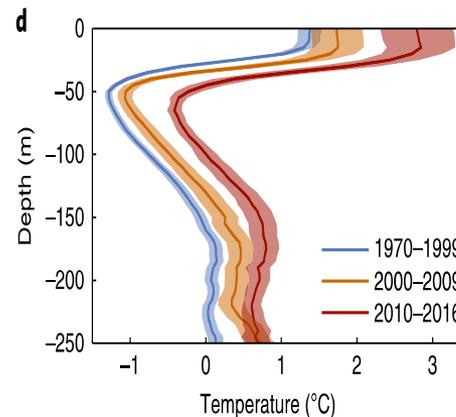
- Less sea ice transport to the Barents Sea
- Loss of salinity-driven stratification

## Polyakov (in prep)

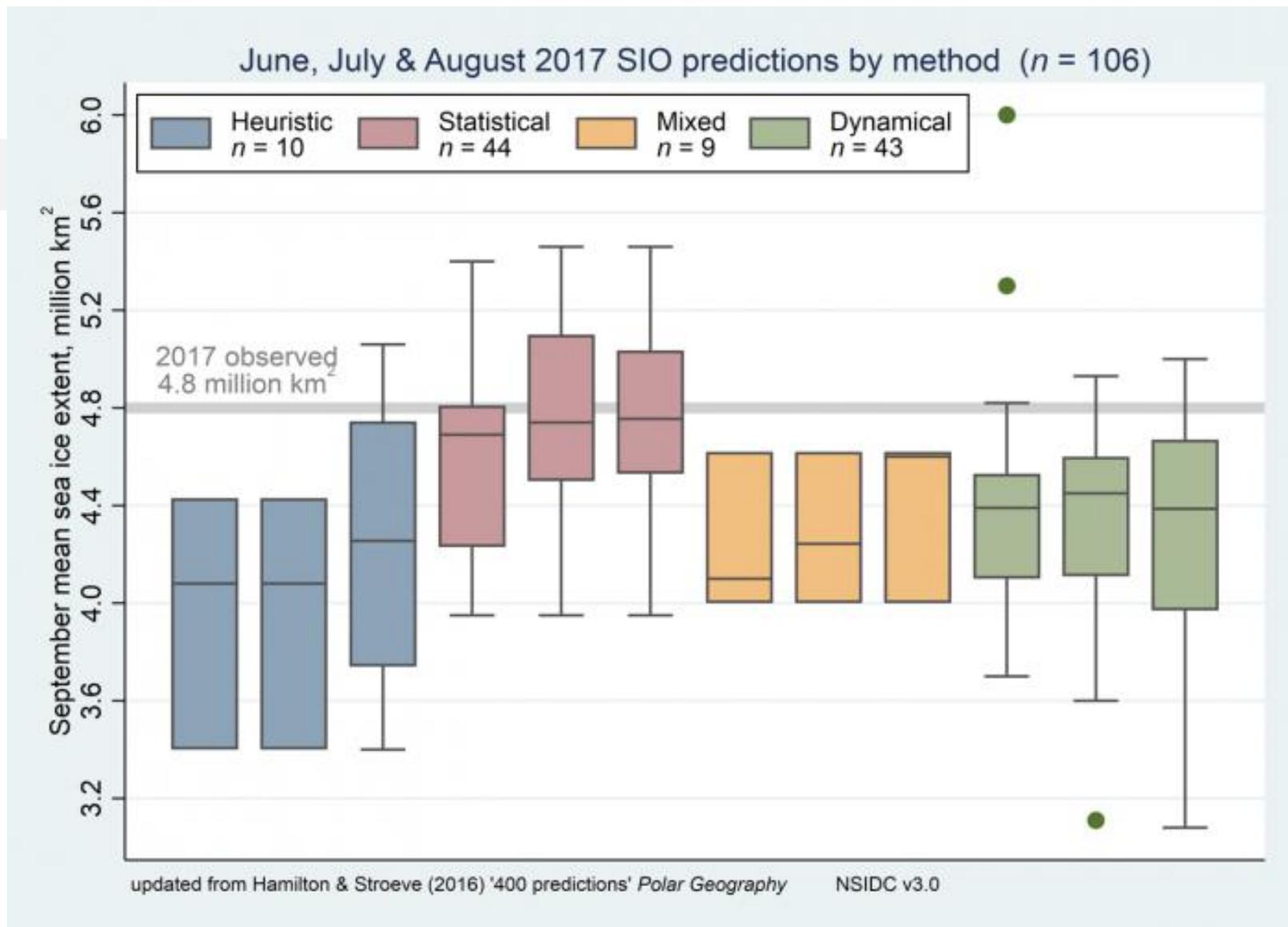
- Loss of double-diffusion in Laptev Sea mooring



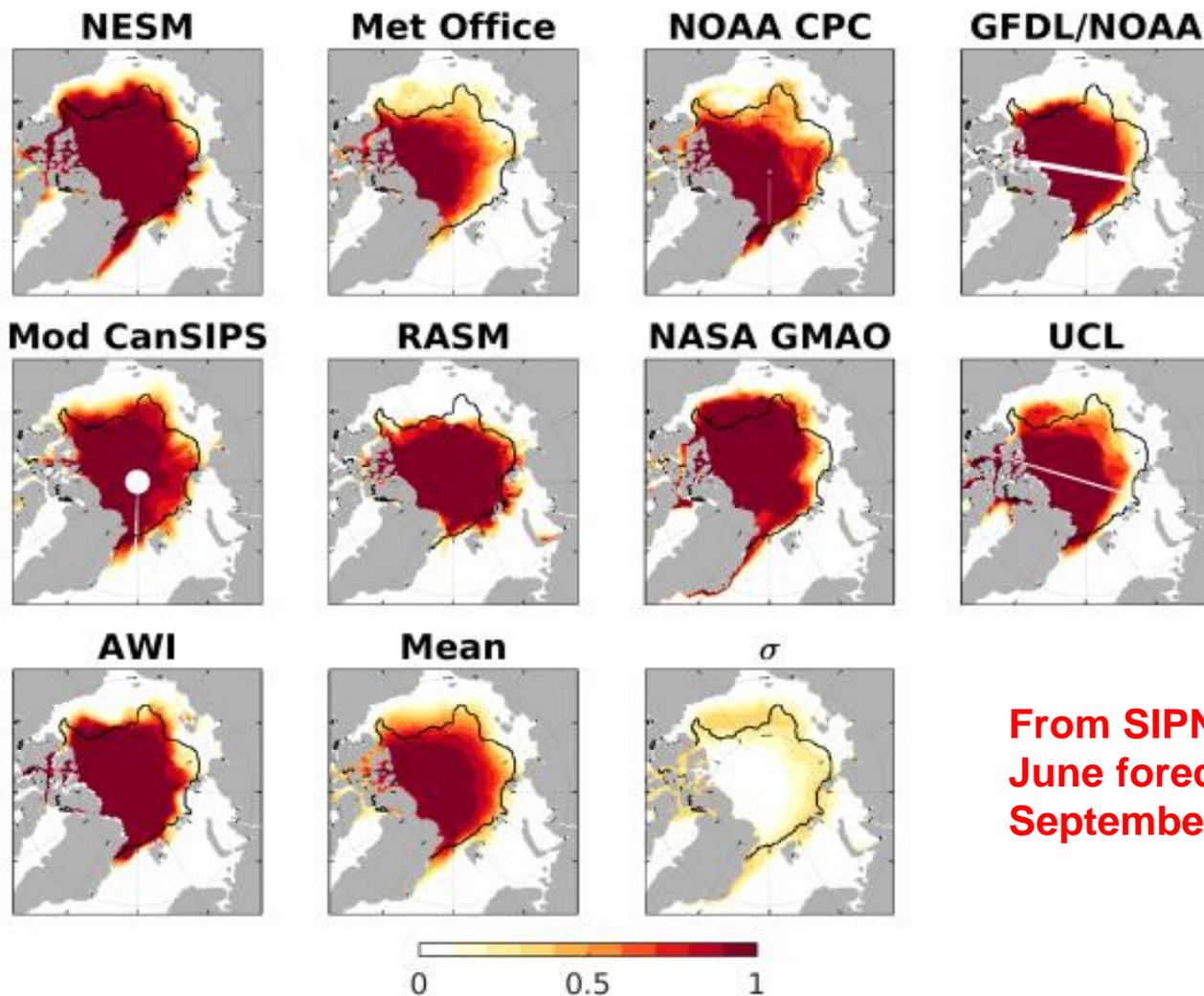
Lique Nat Geo 2015



# Sea ice outlooks (not yet updated 2018)

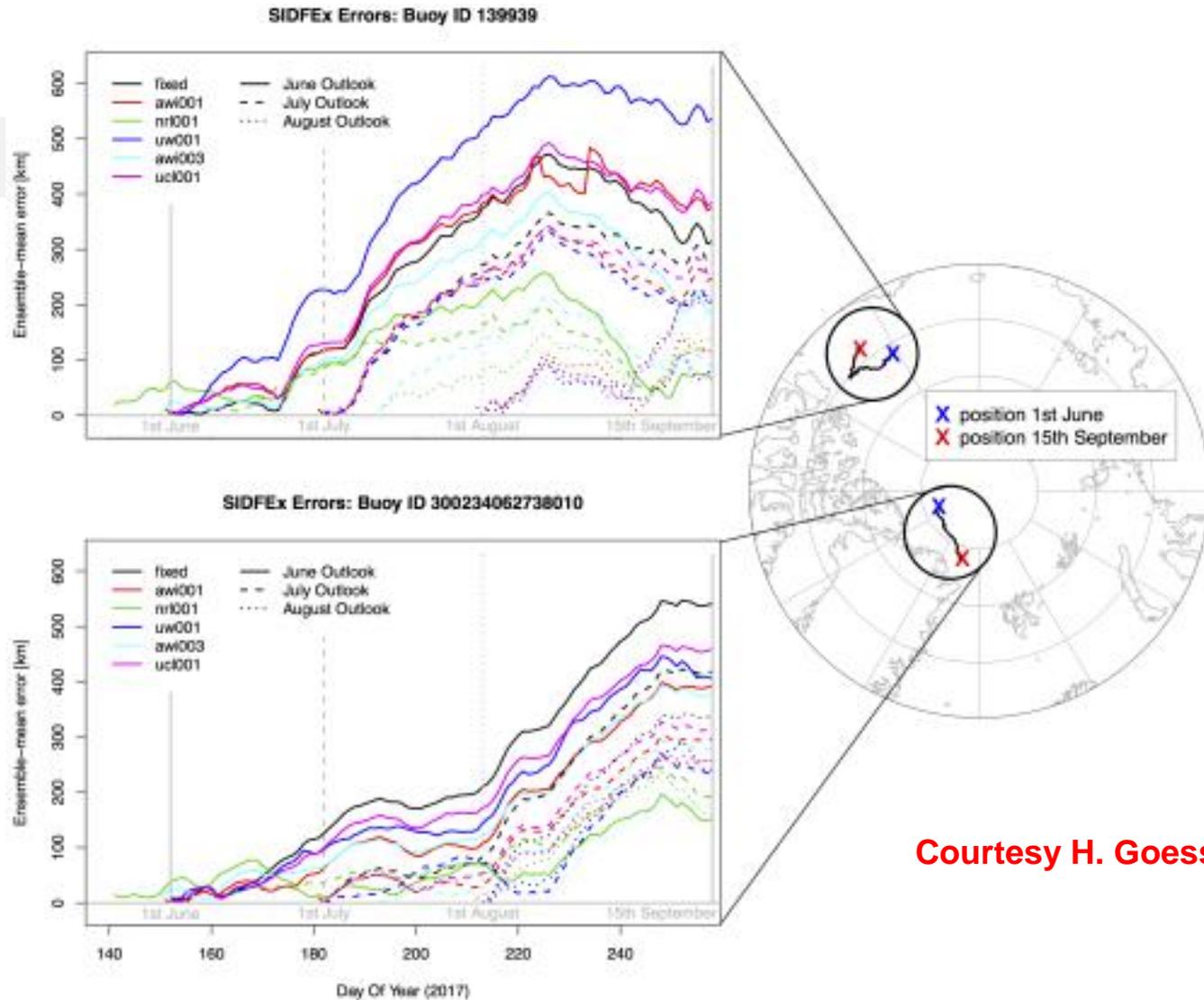


# Sea ice outlooks



From SIPN website  
June forecasts for  
September 2017

# Sea ice Drift experiment: SIDFEx



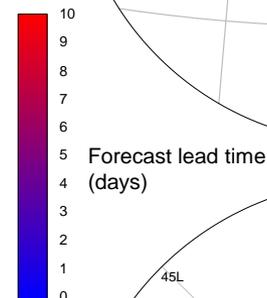
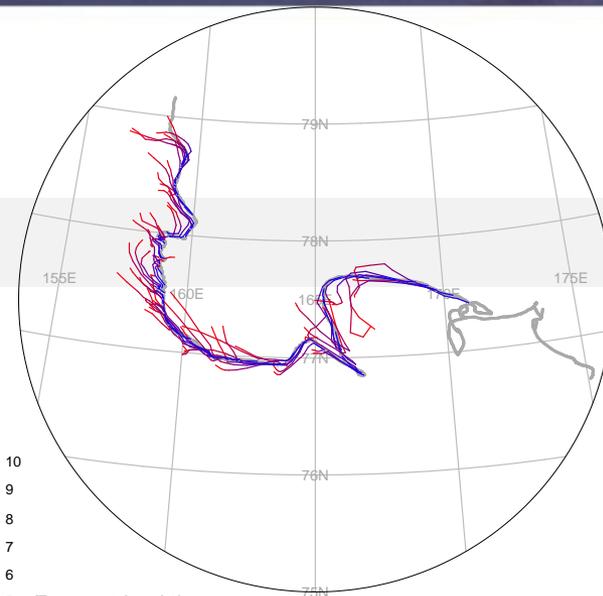
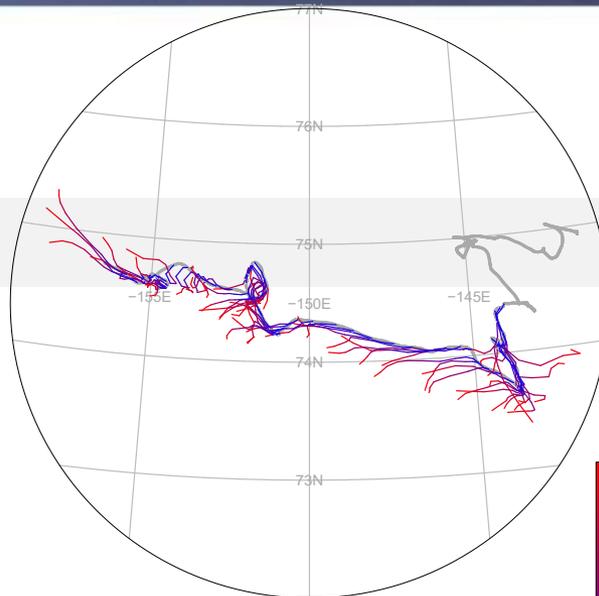
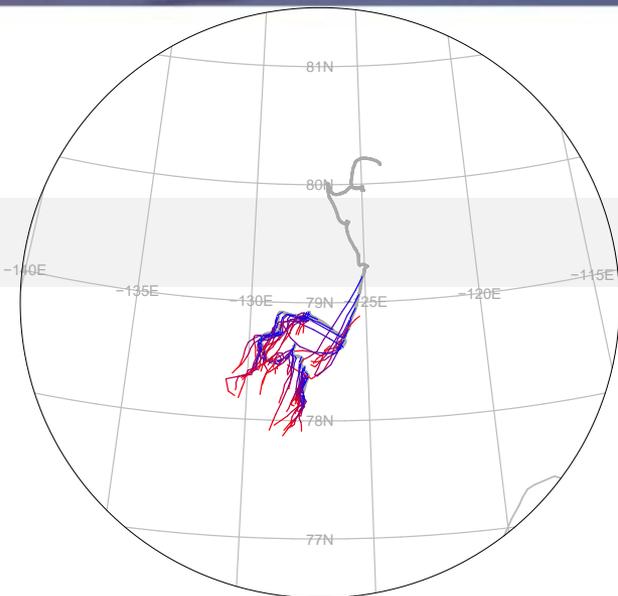
Courtesy H. Goessling, AWI

# SIDFEx Short-term forecasts: ESRL (coupled ensemble)

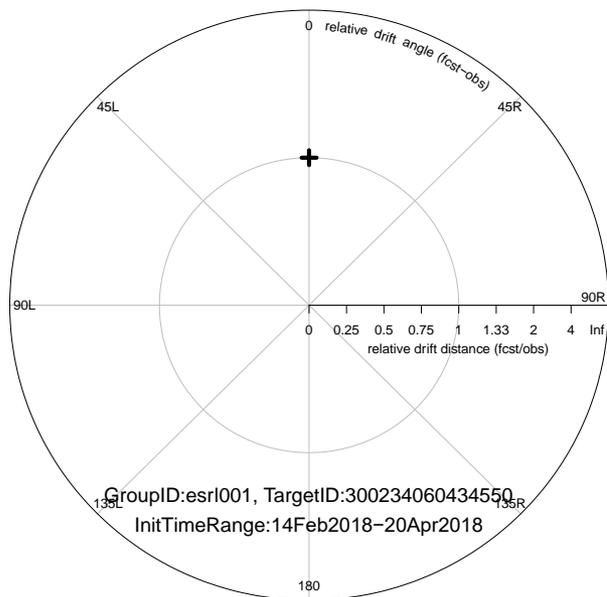
GroupID:esrl001, TargetID:300234060434550

GroupID:esrl001, TargetID:300234063991680

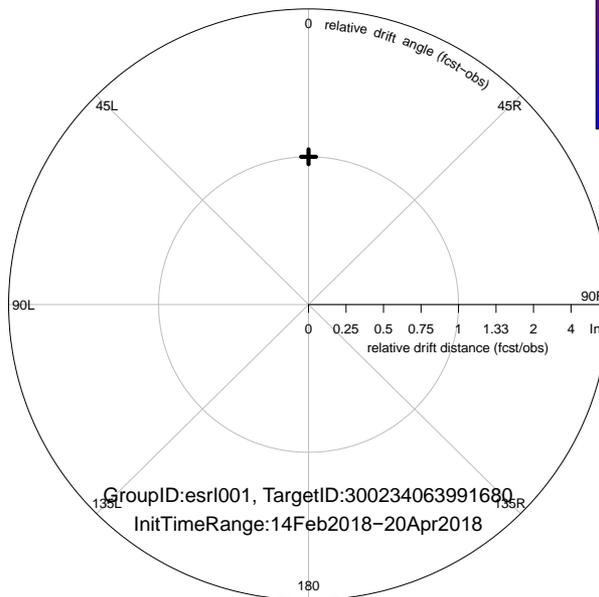
GroupID:esrl001, TargetID:139939



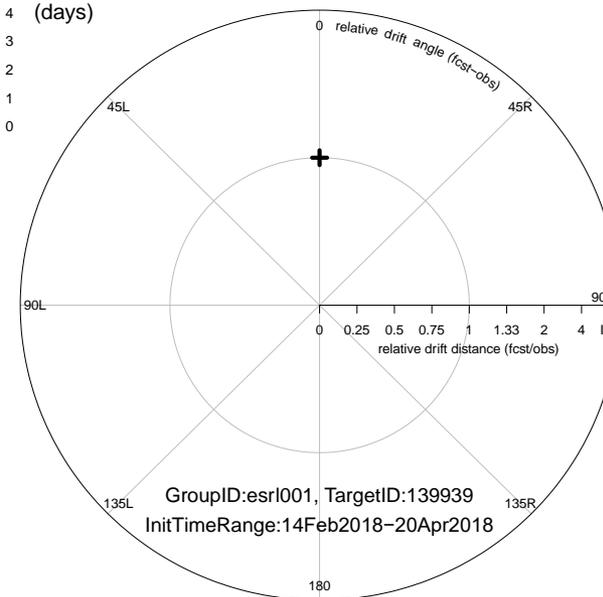
Forecast lead time (days)



GroupID:esrl001, TargetID:300234060434550  
InitTimeRange:14Feb2018-20Apr2018



GroupID:esrl001, TargetID:300234063991680  
InitTimeRange:14Feb2018-20Apr2018



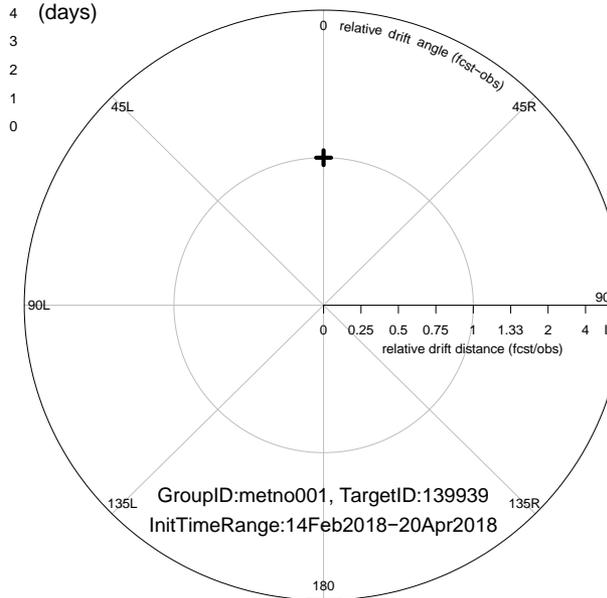
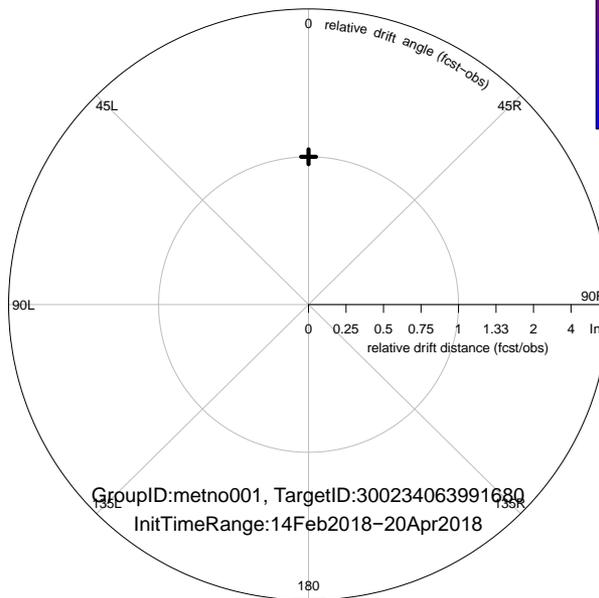
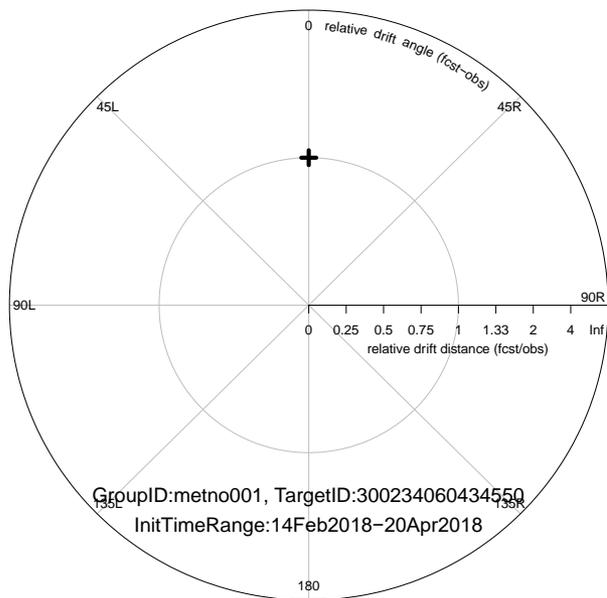
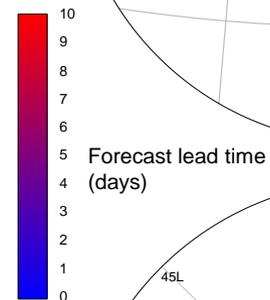
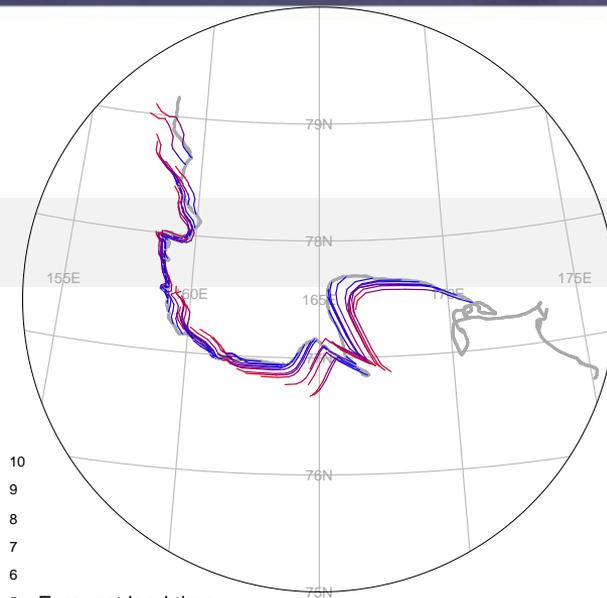
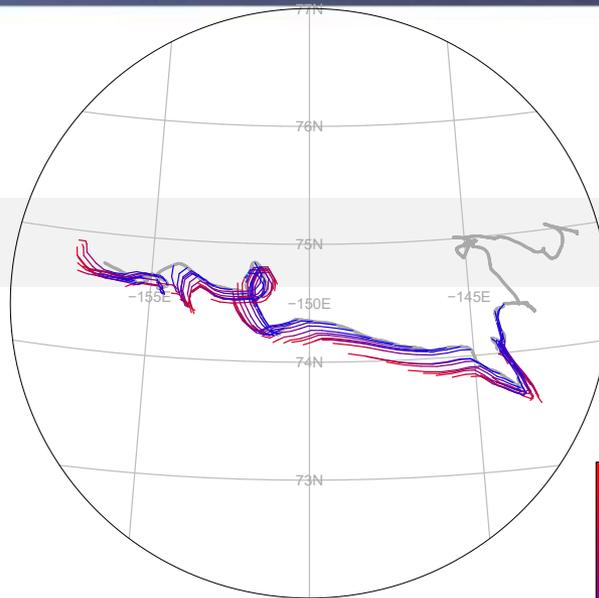
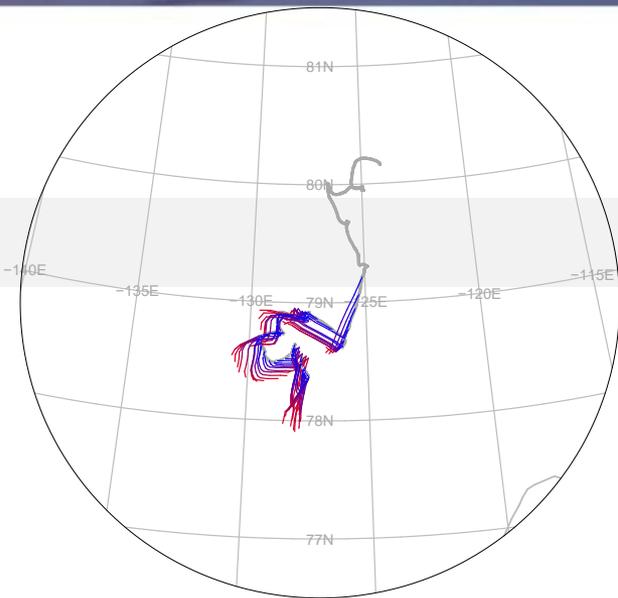
GroupID:esrl001, TargetID:139939  
InitTimeRange:14Feb2018-20Apr2018

# SIDFEx Short-term forecasts: TOPAZ (uncoupled, forced by ECMWF)

GroupID:metno001, TargetID:300234060434550

GroupID:metno001, TargetID:300234063991680

GroupID:metno001, TargetID:139939



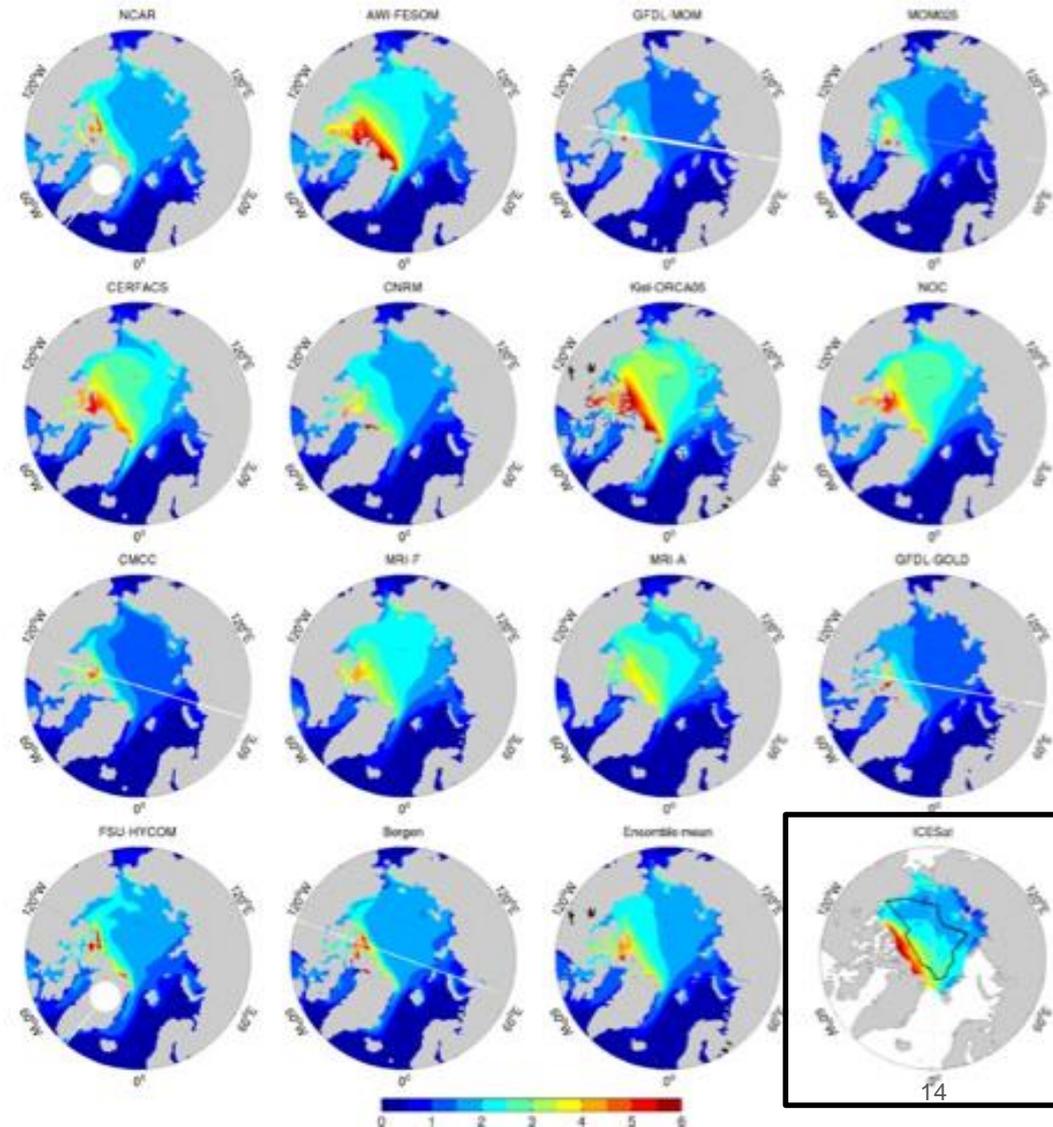
# Climate models exhibit common biases

## Sea ice thickness in CORE II simulations and ICESat observations

Too much in Beaufort Sea  
Too little on European side  
Wang et al. (2016)

### Causes?

- Sea ice drift
- Melt ponds in Beaufort Sea



# Long term business decisions?

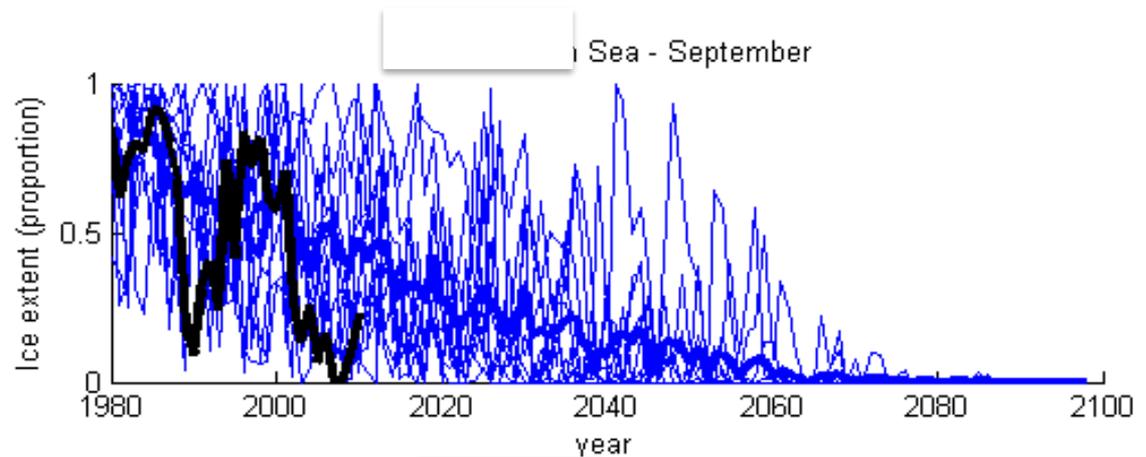
## Example: Shipping in Marginal Seas

### Single variable analysis (sea ice):

Several climate projections fit reasonably well

Seems like we can make a decision, but ...

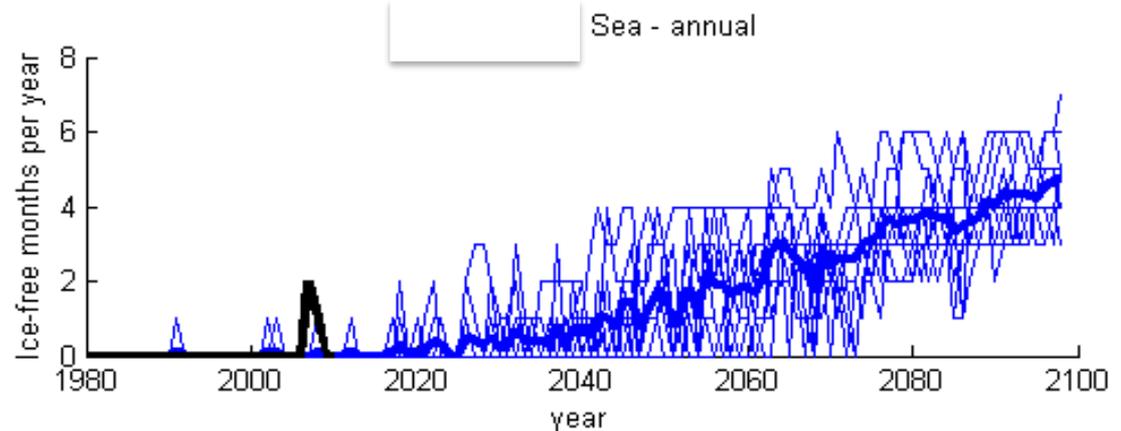
September ice extent



Blue: Selected CMIP5 proj.

Black: reanalysis

Number of ice-free months per year



Graphics by courtesy of Shell

# Example: Shipping in Marginal Seas? (continued)

## Comparison to ocean temperature & salinity:

Cold halocline missing from all  
projections

None of the members satisfies both  
ocean and sea ice conditions

Ice is right for the wrong reason

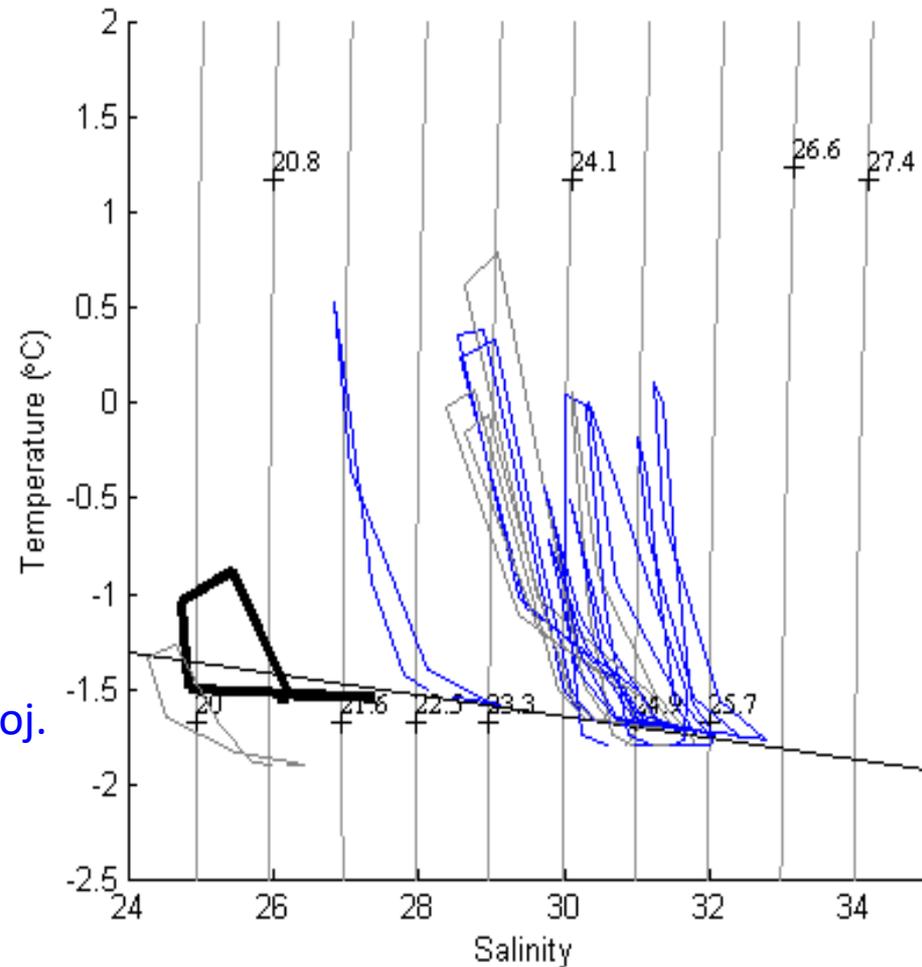
... No answer to the question

## Needs a complete baseline data

Improved ocean models

Blue: Selected CMIP5 proj.

Black: climatology



# Shortcomings in atmospheric models

## Biases in heat fluxes (order of +/- 40 W/m<sup>2</sup>)

- Cloud cover / cloud types / fog
- Shallow stable boundary layer
- Heat fluxes through sea ice leads

## Biases in wind speeds

- Surface roughness
- Shallow stable boundary layer

## Biases in precipitations

- Clouds
- Uncertainty about 100%
- Snow depth important for sea ice freeboard

## Ocean and sea ice model need to compensate for those biases

- Some issues alleviated in coupled models
- Some problems enhanced by couplers

## Most relevant parameterisations date back to SHEBA (90's)

Expect newer observations from YOPP, MOSAiC targeted observations / cruises

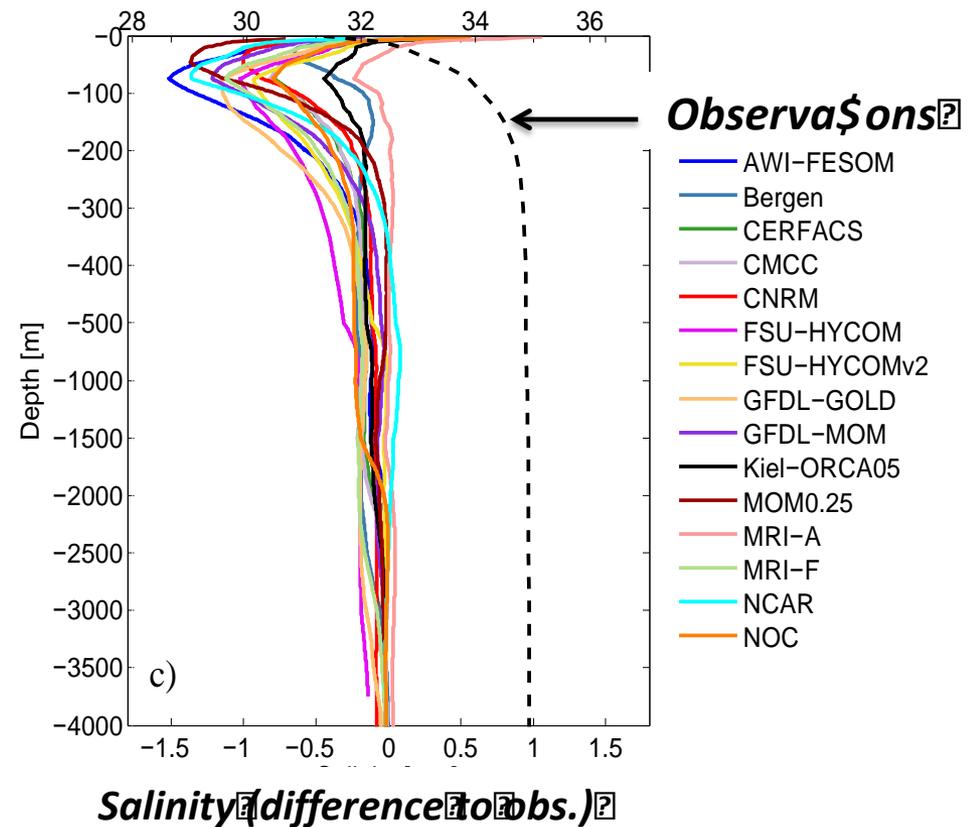
# Shortcomings of ocean models

## Salinity-driven mixing

All models have trouble maintaining the Atlantic Water layer in the Arctic

The simulation of the Cold Halocline Layer is also a common problem.

Illicak et al. (2016)



# Present trends in ocean modelling

## Vertical coordinates

- **Generalized:** HYCOM, MOM6, MPAS
- **Z-levels:** MITgcm, NEMO
- **Terrain following:** ROMS
- **Each has advantages and shortcoming**

## Unstructured grid models

FESOM, FELIM, MPAS...

## Numerical schemes:

Lemarié (OM 2015) supports coupled space-time numerical schemes (as in MITgcm)

## Trends: modelling of ecosystem, pollutants, plastics

More tracers

## Mixing schemes

- **KPP (advanced):** HYCOM, MITgcm, ROMS
- **K-Eps (simpler):** NEMO
- **GLS (advanced):** NEMO (tested in Arctic?)

## Trends: more mixing to come

- **Bigger waves**
- **Inertial waves transmission through more compliant ice (Gimbert et al. 2012)**

# Present trends in sea ice modelling

## Sea ice models

### CICE and LIM (soon SI<sup>3</sup>) community models

Most popular rheologies are EVP and VP

Use the same grid as the ocean model

Focus on ice thermodynamics (ice thickness distribution, ice salinity, melt ponds)

Resolve deformations at 10 times the grid cell

### neXtSIM

Use the Maxwell-Elastic-Brittle rheology

Lagrangian mesh with remeshing

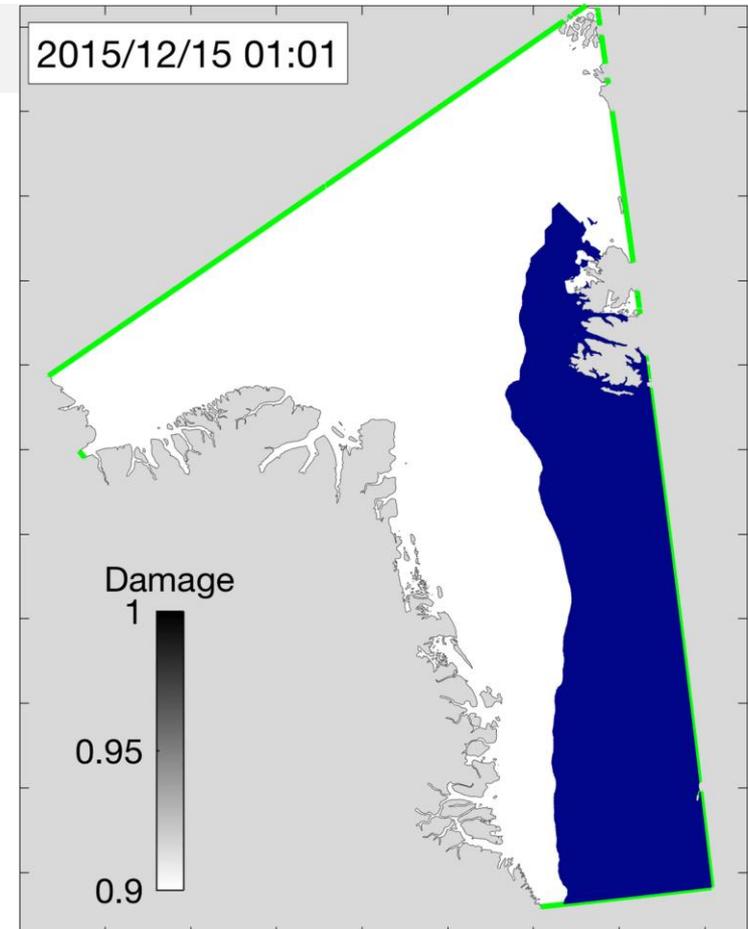
Simpler thermodynamics

Resolve deformations at the grid cell.

May not need very complex thermodynamics.

Akin to Sulsky's MPM method.

More challenging coupling



# Present trends in wave modelling

## Waves in ice

### Attenuation of waves in ice

- Combination of scattering and drag
- Implemented in Wavewatch3 (Ardhuin) and WAM (Bidlot)

### Breaking of ice by flexural wave action

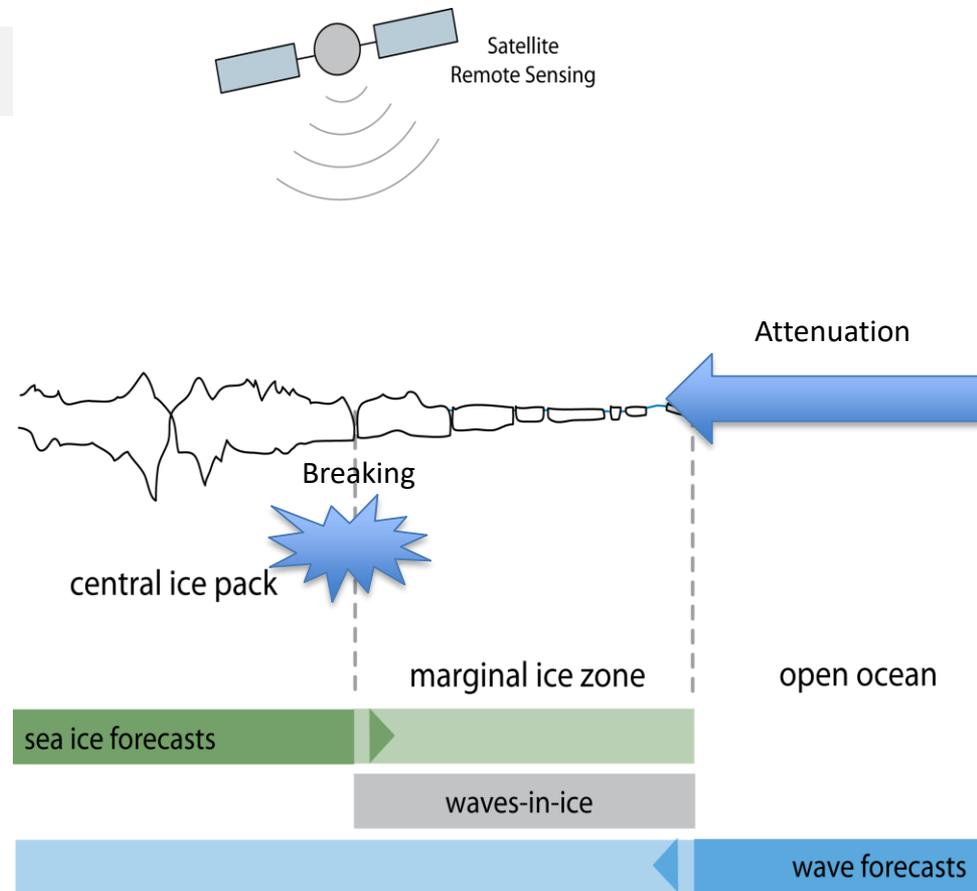
- Implemented in CICE by LANL (Bitz & Kohout), NERSC (Williams) and NOC (Hosekova).
- Implemented in neXtSIM (Williams)

## Requires coupling of waves and sea ice models

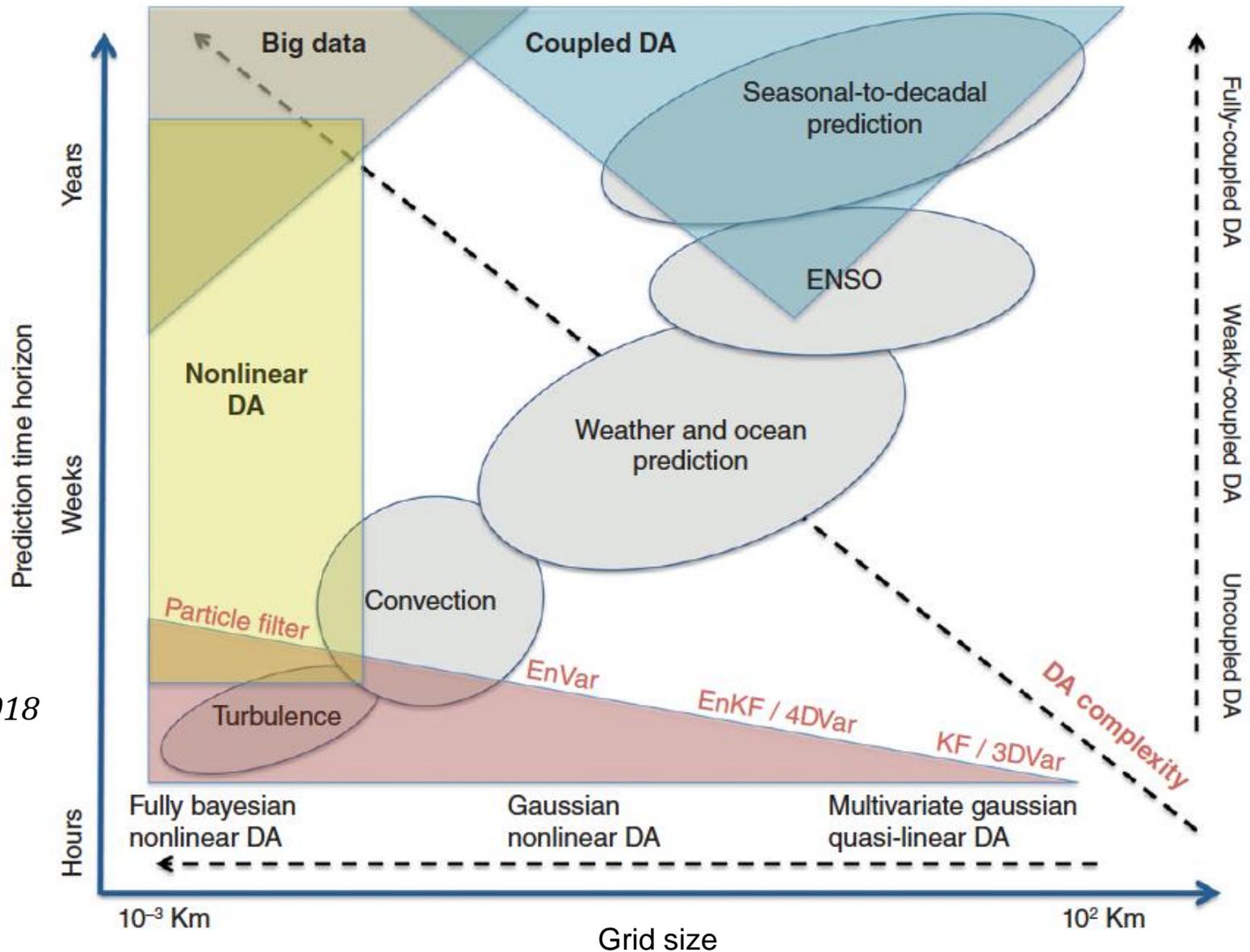
### Not yet included in climate projections

### Limitations:

- Too few observations of breaking events
- Wave scattering difficult to model



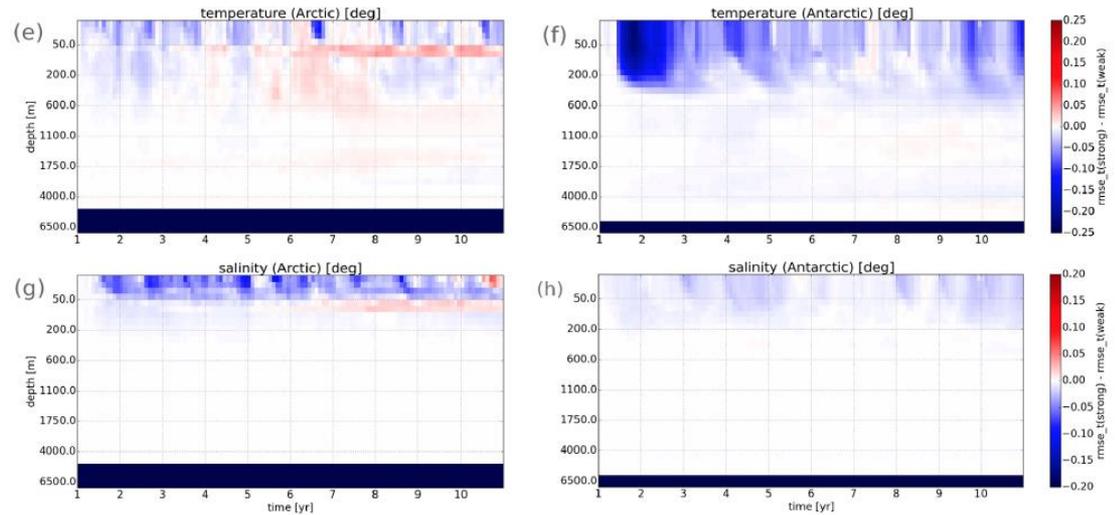
# Present trends in data assimilation



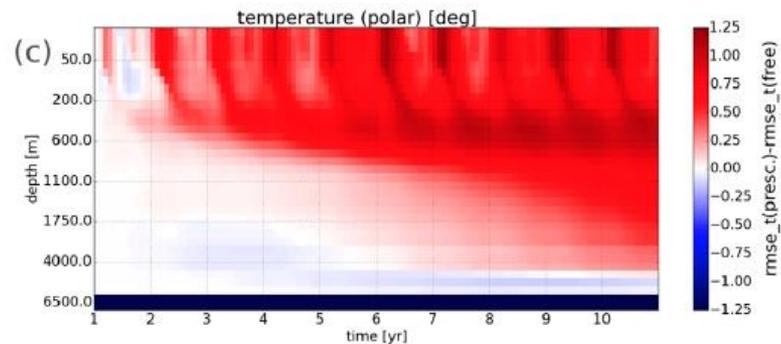
*Carrassi et al., 2018*

# Assimilation in Coupled Earth System models

- Example among others:
- NorESM: Earth System Model
- CICE4: multi-category
- EnKF
- Assimilation of ice concentrations
- Comparison of weakly vs. strongly coupled assimilation
- And vs. simple prescribed ice-ocean covariance



Blue: Strong > weak assimilation



Red: Prescribed worse than free run

**Strong coupled DA > weakly coupled >> prescribed**

# Present fashions: machine learning / AI

## Machine Learning

Should apply to forecasting in principle.

Relies on many analogues for training

Favoured by stationarity

Not ideal for changing situations (Arctic ...)

Table 10. Features of various Artificial Intelligence (AI) applications.

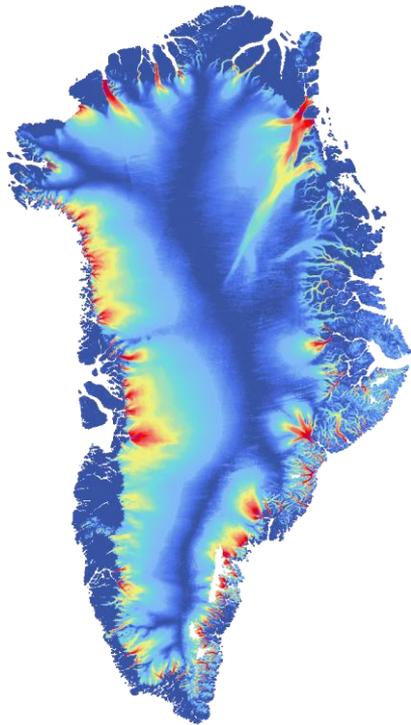
Type of Application	Rules are known and do not change	The environment is known and stable	Predictions can influence the future	Extent of Uncertainty (or amount of noise)	Examples
Games	Yes	Yes	No	None	Chess, GO
Image and speech recognition	Yes	Yes	No	Minimal (can be minimized by big data)	Face Recognition, Siri, Cortana, Google AI
Predictions based on the Law of large numbers	Yes	Yes	Minimally	Measurable (Normally distributed)	Forecasting the sales of beer, coffee, soft drinks, weather etc.
Autonomous Functions	Yes	Yes	No	Can be assessed and minimized	Self-Driving Vehicles
Strategy, Competition, Investments	No	No	Yes, often to a great extent	Cannot be measured (fat tails)	Decisions, Anticipations, Forecasts
Combinations of the above	It may be the ultimate challenge moving towards GAI (General AI) but also increasing the level of complexity and sophistication of algorithms				Eventually it can cover everything

# About icebergs

Calving from Greenland: ~375 Gt of ice per year.

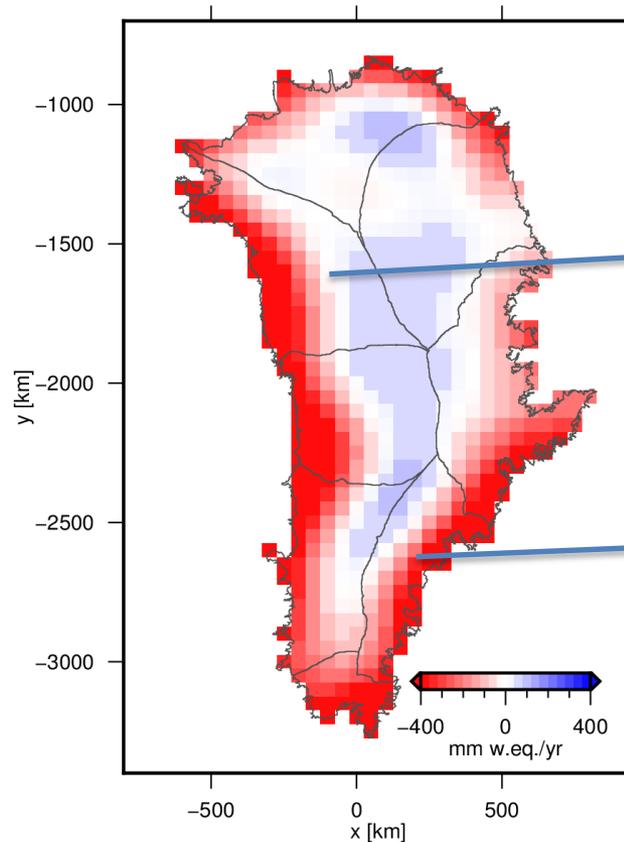
Twice as fast in 2011-2014 as over 2003-2008 (AMAP, SWIPA 2017)

Most icebergs remain trapped in Greenland fjords

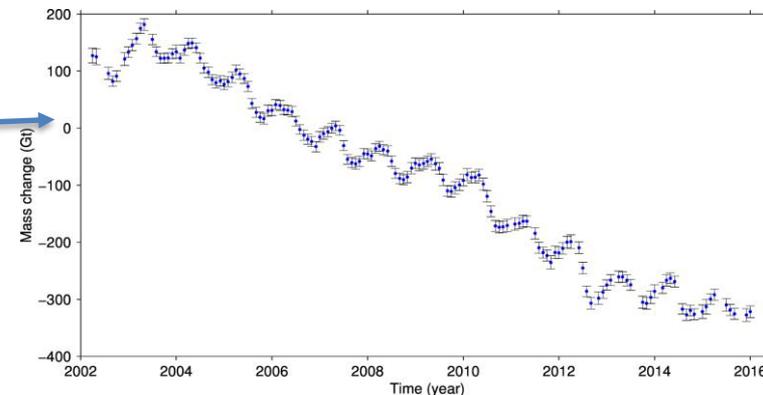
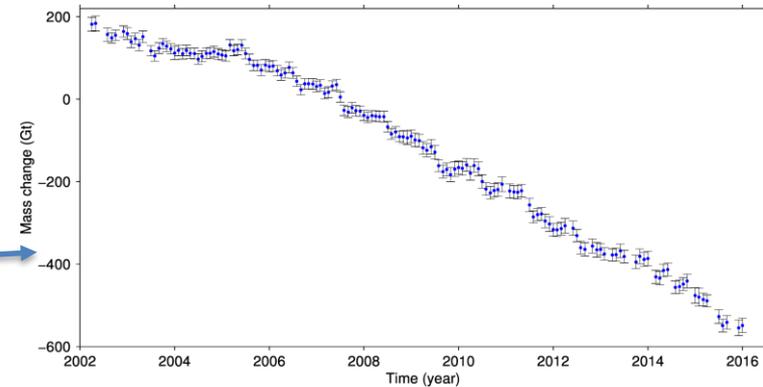


Ice velocities Dec 2017 –  
Feb 2018

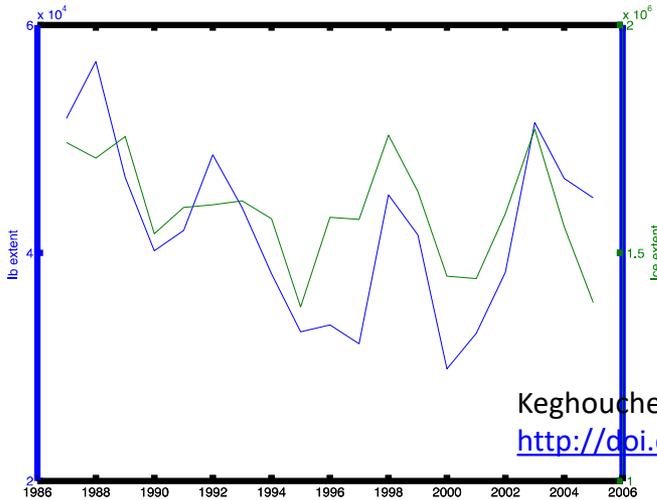
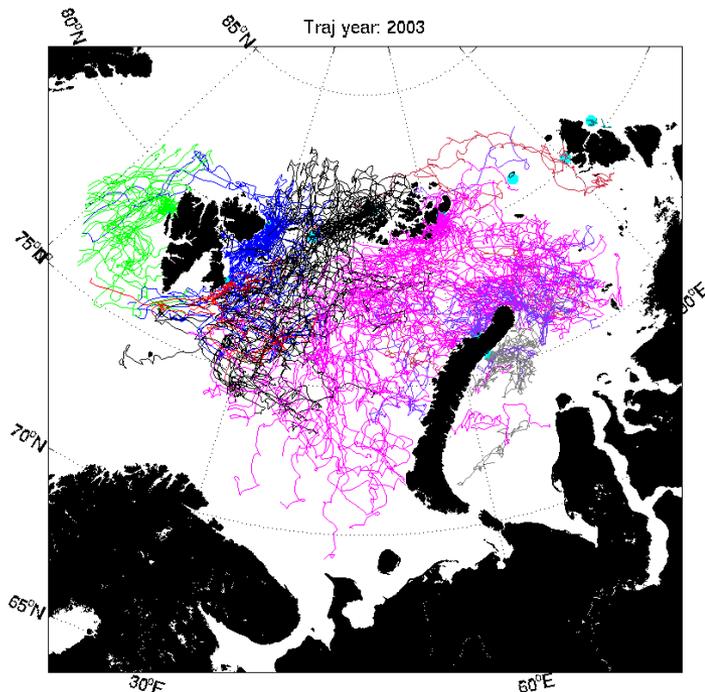
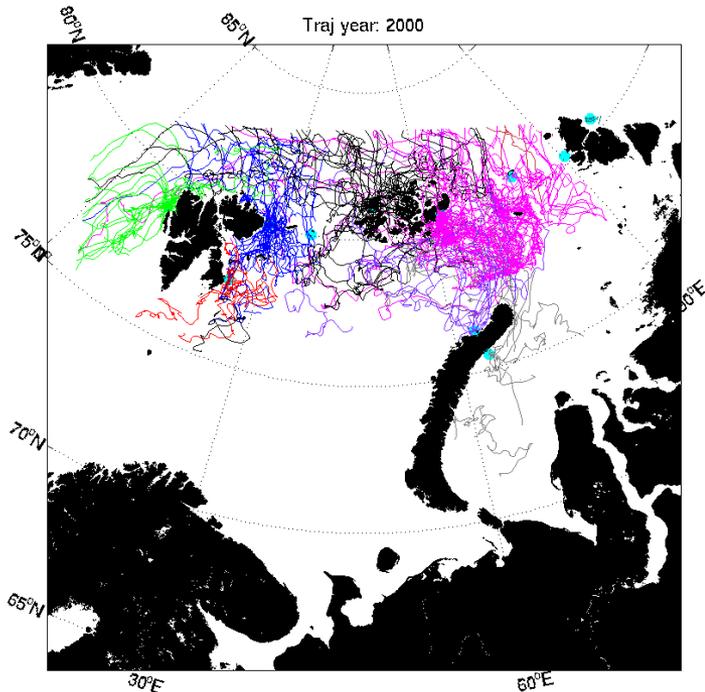
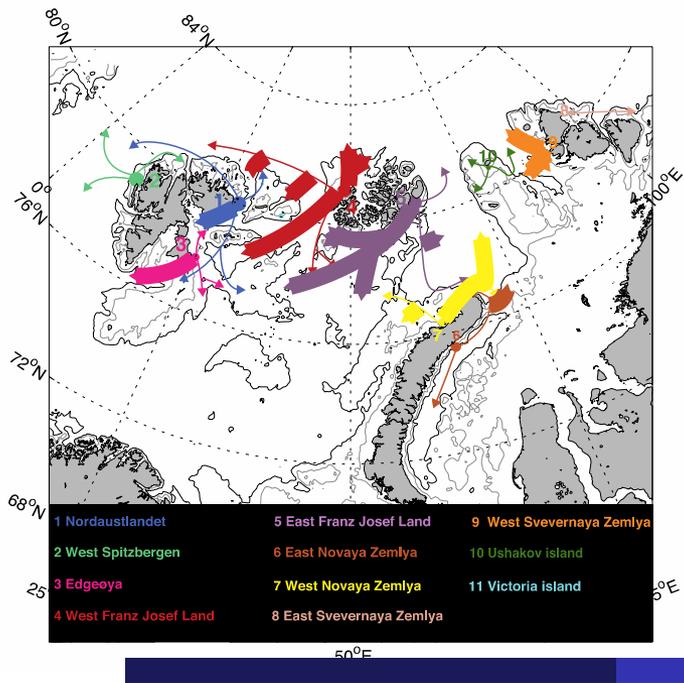
02/10/2018 Name of the event, Place



Gravimetric Mass loss 2002 – 2016

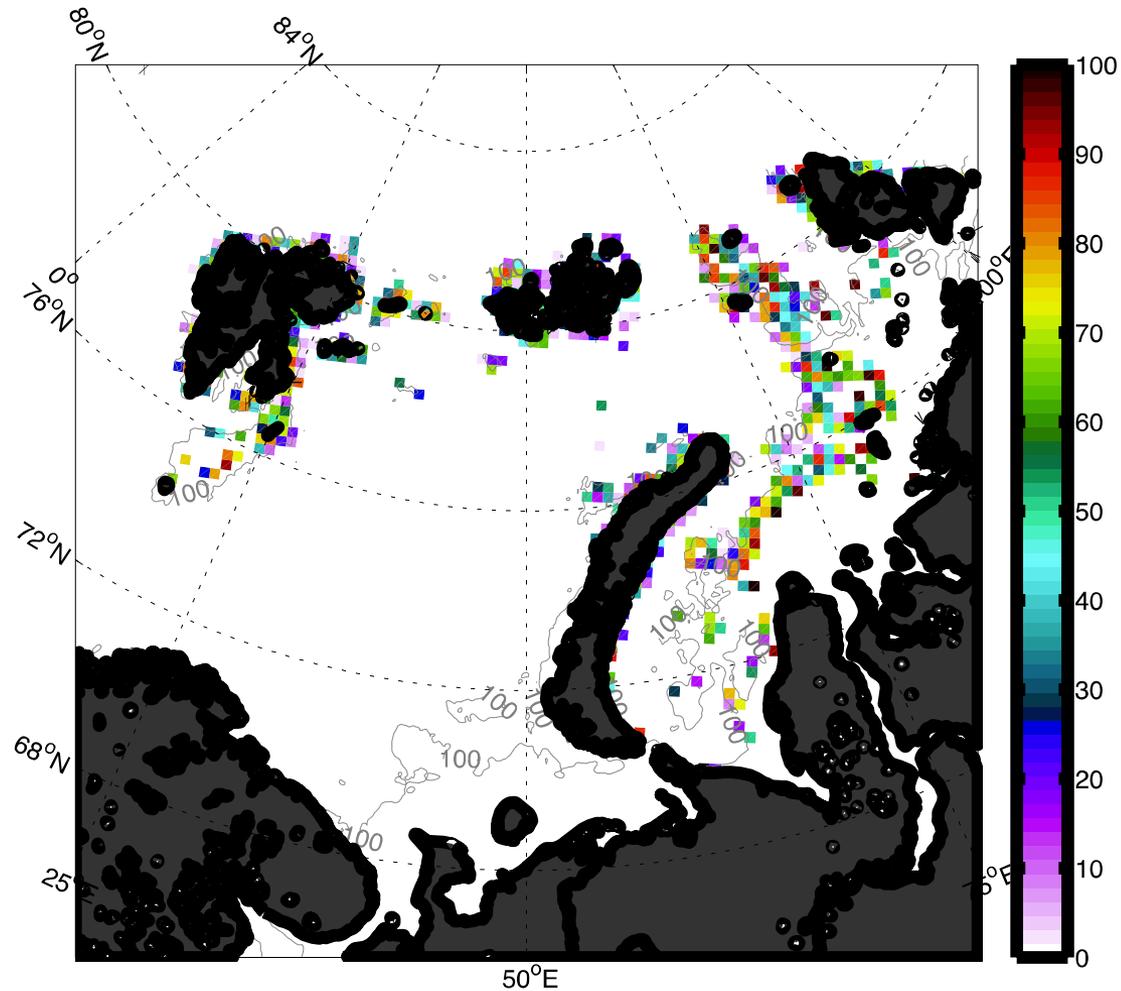


# About icebergs in the Barents Sea



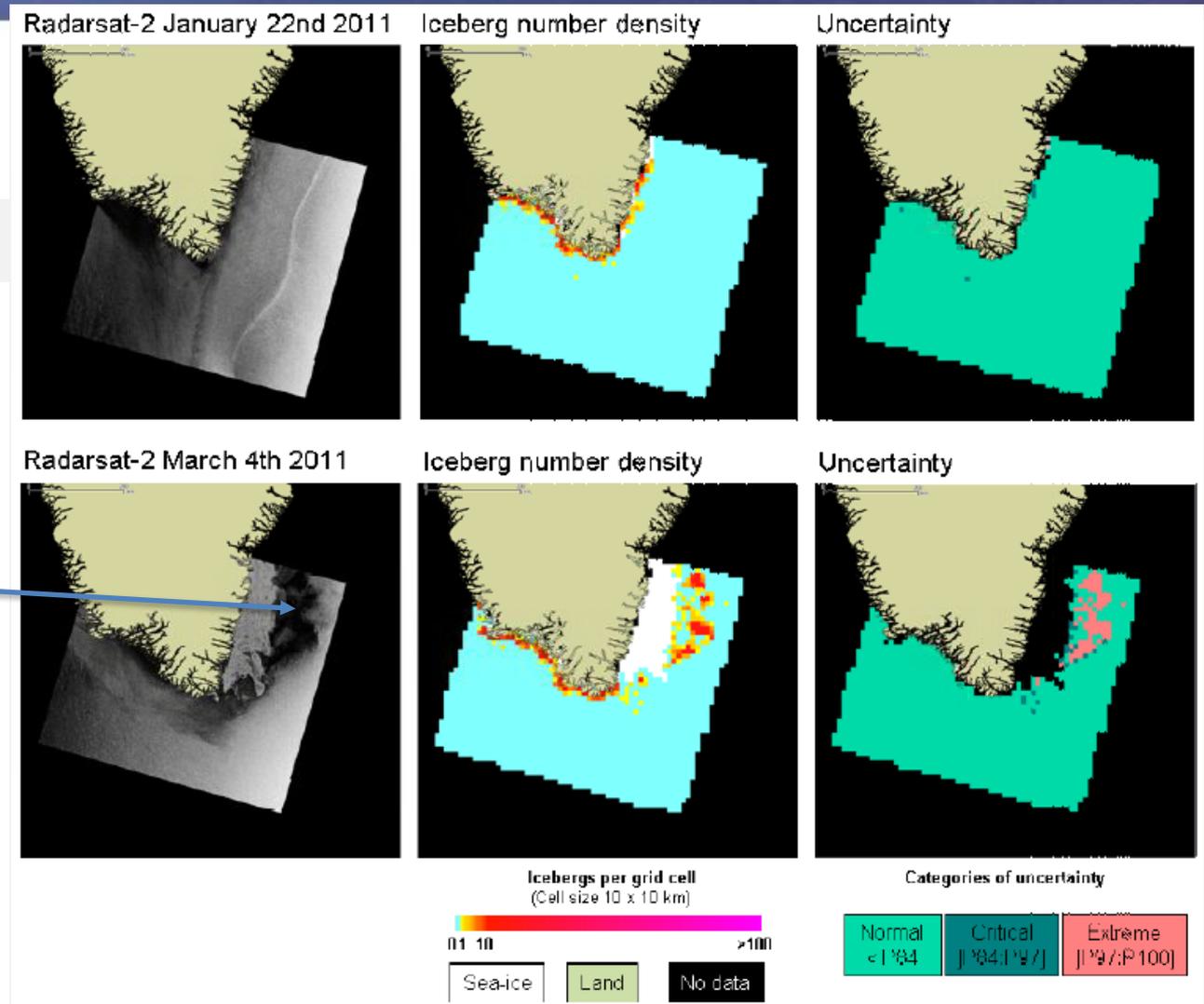
Keghouche, I., Counillon, F., & Bertino, L. (2010).  
<http://doi.org/10.1029/2010JC006165>

# Grounding of icebergs



**Probability of encountering at least one grounded iceberg in a 25x25 km square  
Based on a 10-years simulation (Keghouche et al. 2010)**

# Satellite observations of icebergs



Automated CMEMS SAR-based iceberg concentration products from DMI (Whole Arctic)

<http://marine.copernicus.eu> SEAICE\_ARC\_SEAICE\_L4\_NRT\_OBSERVATIONS\_011\_007

# Present trends in iceberg modeling

## Main unknowns:

- Iceberg calving rates
- Size distribution of icebergs

## Drift simulation

- Winds
- Currents
- Sea ice drift
- Waves

## Trends:

less sea ice, more spreading of icebergs.

Also faster melting of icebergs

Remote sensing of icebergs

New techniques, new satellites

# More or fewer icebergs?

## More

Warmer ice sheets / glaciers

Less sea ice

Warmer ocean water

More calving

More icebergs on the loose

## Fewer

Warmer water

Less sea ice

More waves

More efficient melting / erosion

... on shorter trajectories

# Ocean acidification

## Anthropogenic Carbon

If CO<sub>2</sub> emission continue to increase

- Within the 21<sup>st</sup> Century
- Unsaturated conditions for aragonite (carbonate mineral) in Arctic / S. Ocean
- Aragonite is part of shells and reef structures
- Detrimental effects for pteropods and cold water corals

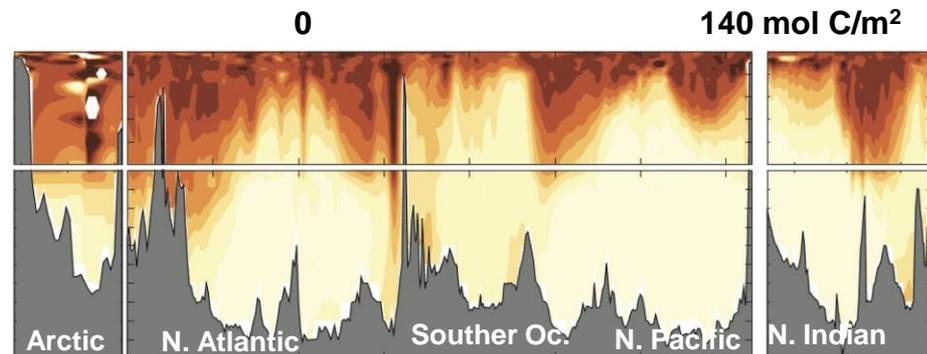
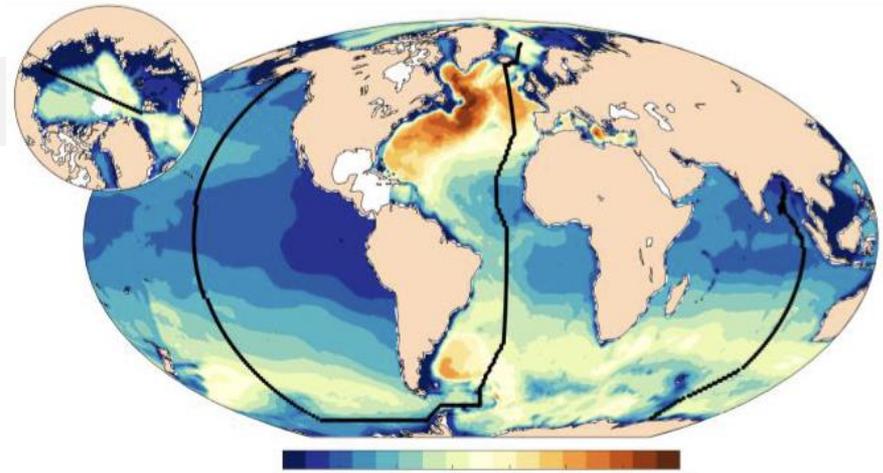
Ocean acidification acts in combination with other stressors of marine ecosystems.

May not affect fish directly, but through their food supply and habitat.

Not clear how a whole ecosystem will respond.

Olsen et al.

UN Foresight Brief, July 2018



GLODAP2  
Lauvset et al. 2016

# Marine Ecosystem: Fish migrations

## Fish migration

- Recent warming in the Barents Sea has led to a change in spatial distribution of fish communities
- with boreal communities expanding northwards
- at a pace reflecting the local climate velocities

Fossheim et al. (Nature Climate Change 2015).

Change of fish communities confirmed by birds diet (black-legged kittiwakes).

Vihtakari et al. (Scientific Reports 2018)

Fish migration limited to the North by deep waters

## Primary Production

- Declines in sea ice cover in the Arctic Ocean can fundamentally alter marine ecosystems.
- Annual net primary production (NPP) in the Arctic Ocean rose 30% between 1998 and 2012.
- Increased NPP was associated with reduced sea ice extent and longer growing season.
- Increased nutrient fluxes may also play an important role.

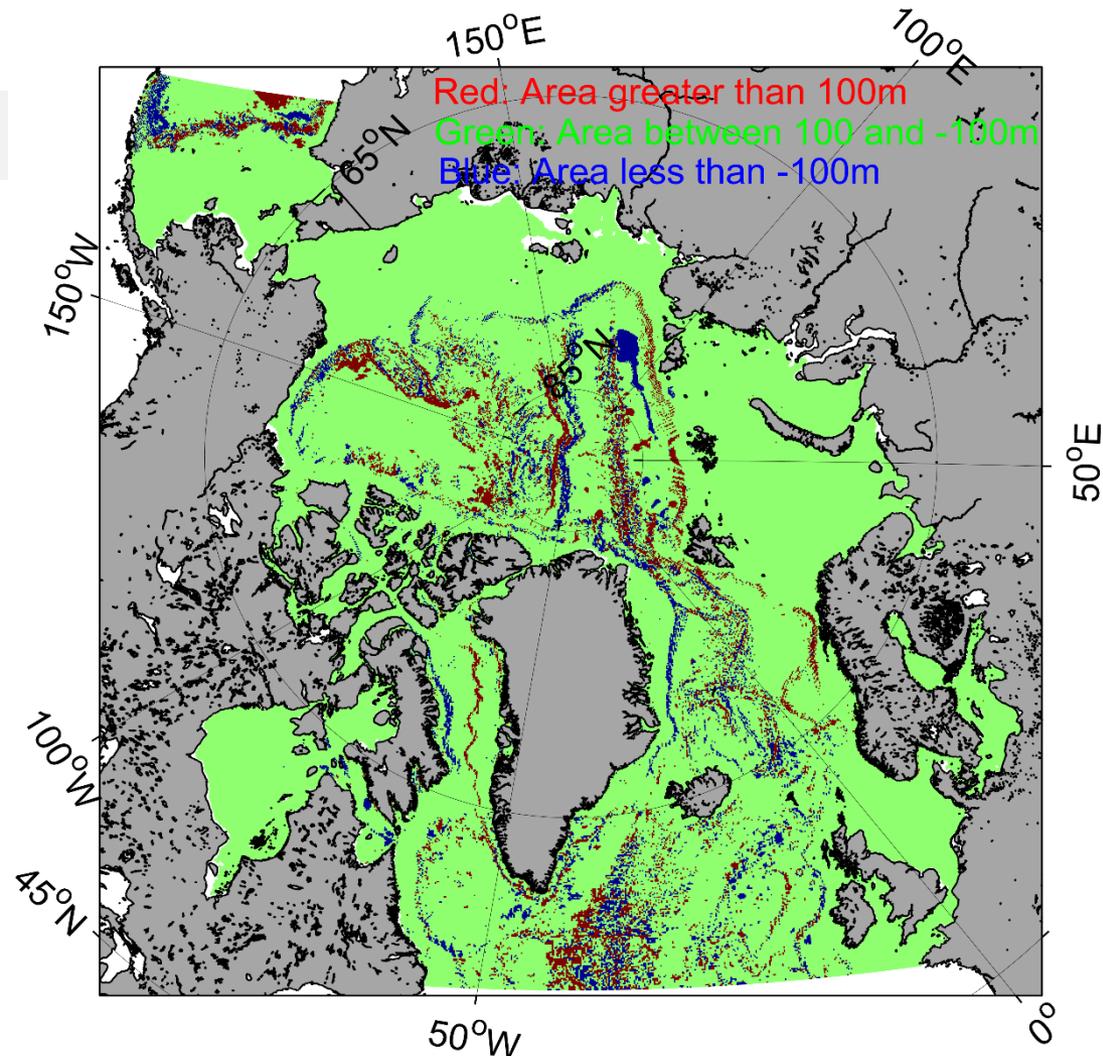
Arrigo and van Dijken (Prog. Ocean. 2015)

# Bathymetric maps

Differences between 2  
bathymetric datasets  
At the same resolution  
Both recent versions  
ETOPO minus GEBCO

ocean basins at resolution  
<10km

Less than 10% of ocean  
bottom surveyed.



# Gaps and uncertainties in current practice

## Basic knowledge

Clouds

Sea ice

Greenland ice sheet

Ocean mixing

Ocean Biology

Topography

Sometimes the understanding is there, but not the quantitative knowledge

## Other uncertainties

Funding for HPC power

Funding for modelling initiatives (many are US-based)

Continuity of space programmes

Sustainability of in situ measurement programmes

# What can YOU do?

## Support (real) model biodiversity

Regional modeling studies / hindcasts

Ensure models deliver what they promise

Support development of coupled

## Support young researchers

## Wake up your data!

EMODNET

<https://emodnet-ingestion.eu/>

And/or CMEMS

[servicedesk.cmems@mercator-ocean.eu](mailto:servicedesk.cmems@mercator-ocean.eu)

# Assignment

- **How has our understanding of changes and model projections evolved since 2008?**
  - Understanding was pretty good (man-made global warming)
  - Arctic amplification more complex than thought 10 years ago, not a solved question.
  - Model projections have improved slightly (sea ice area decline)
  - Model projections are increasingly using advanced + coupled data assimilation
- **What is current best practise, including the most appropriate models, downscaling approaches and analysis techniques?**
  - Real model biodiversity (less inbreeding, new ideas)
  - Better model design
- **Is current practice at a state where it can be relied upon for long-term business decisions?**
  - Yeah, go for renewable energies
  - High stakes / high uncertainty
- **What are the recognised gaps and uncertainties in current practise**
  - Clouds, biogeochemistry, sea ice, ocean mixing, Greenland ice sheet and other glacial melt
  - Sustainability of observing systems (satellite and in situ).
  - Future supercomputers will not support the needs of models and data assimilation
- **and what needs to be done to close these gaps and address the uncertainties?**
  - Heavy measurement campaigns, shared data.
  - Support investments in space programs, model developments, HPC infrastructure
  - Step-change in model developments,
  - Support indigenous people in keeping traditional knowledge



**Thank you!**