

COMBINE General Assembly  
Met Office Hadley Center, Exeter, 24-27 May, 2011



# Global sea-ice data assimilation in NEMO-LIM

Towards systematic biases reduction in modeled sea-ice  
concentration and thickness

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**UCL**

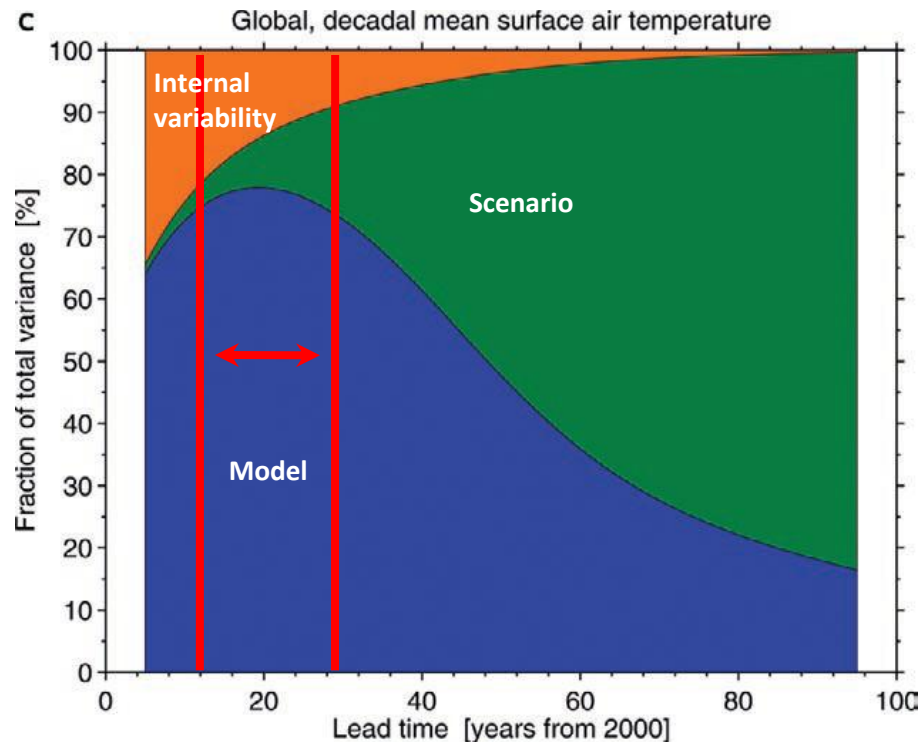
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# Decadal climate prediction: good practices



The fraction of total variance in decadal mean surface air temperature predictions explained by the three components of total uncertainty (Adapted from *Hawkins and Sutton, 2009*)

Reliable climate decadal predictions : what do they rest on?

**Sea-ice** decadal prediction

**Reliable models ?**

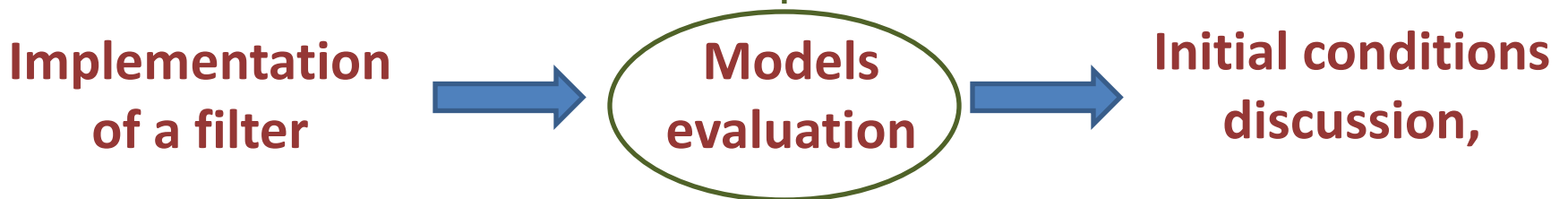
**Reliable initial conditions ?**

# Outline

## 1. Importance of sea-ice model physics



## 2. Multivariate sea-ice data assimilation



# 1. Model sea-ice physics

*How sensitive is the skill of sea-ice models to the representation of physical processes?*

# 1. Importance of model physics

## Experimental setup

NCEP/NCAR daily surface temperatures and winds  
Monthly climatologies of relative humidity,  
cloud cover, precipitations and river runoff

~ 1° resolution (climatic-like)  
1948-2007 simulation  
Focus on 1983-2007

2 sea ice models

Ocean model



**LIM2**

*Fichefet and Morales  
Maqueda, 1997*

- Simple ice thickness dist.
- 2+1 layers ice and snow
- Basic brine modelling
- VP rheology
- B-grid

**LIM3**

*Vancoppenolle et al., 2009*

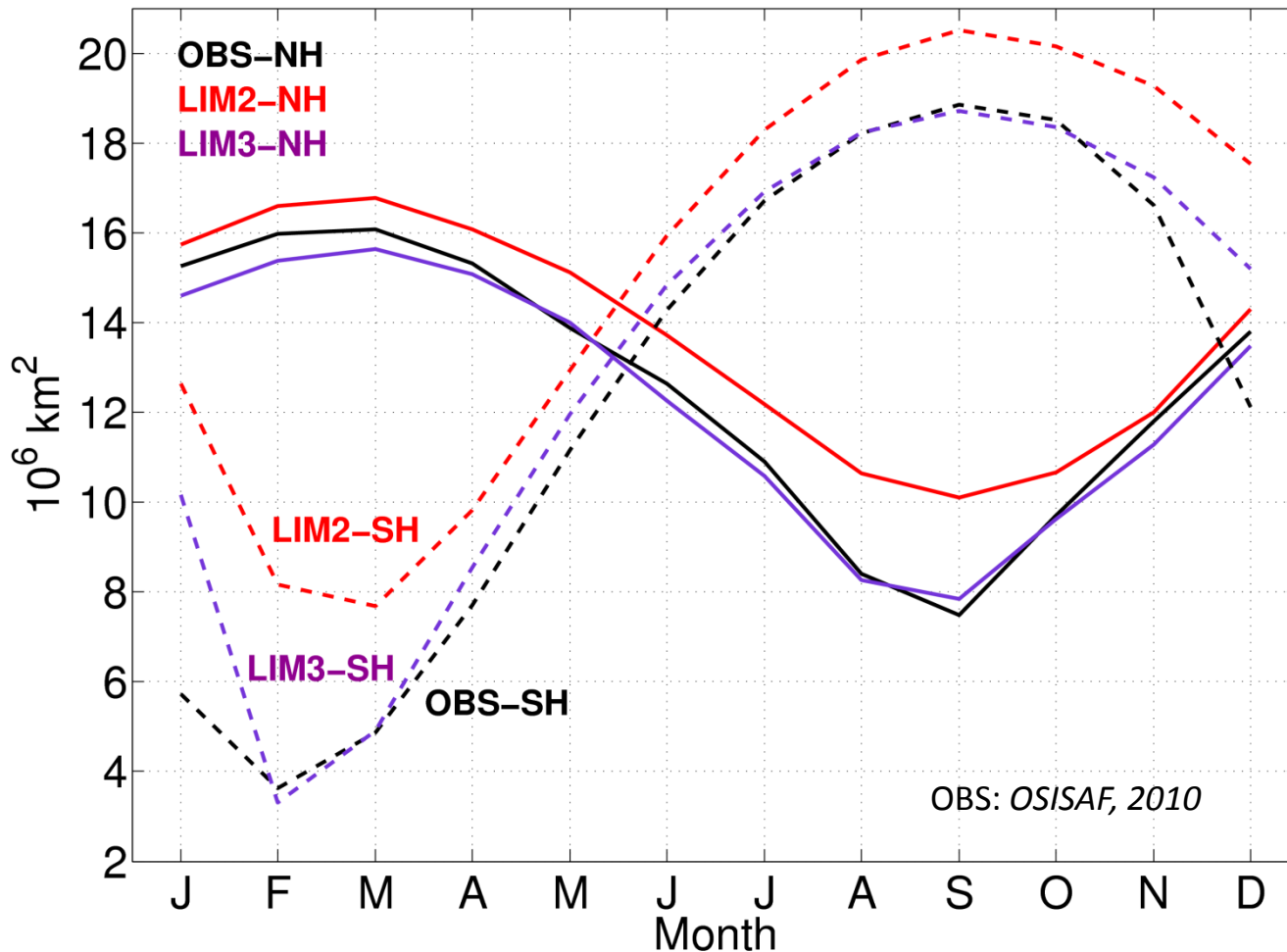
- 5 ice categories
- 5+1 layers ice and snow
- Explicit brine, salinity distribution
- EVP rheology
- C-grid

**NEMO 3.1**  
*Madec, 2008*

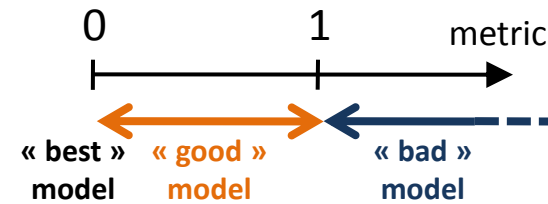
- Primitive equation free surface OGCM
- Level-1.5 turbulence closure scheme
- Isopycnal mixing + G&M param. of eddy-induced tracer advection
- 42 vertical levels
- Salinity restoring

# 1. Importance of model physics Models evaluation

Monthly mean seasonal cycle of sea ice extent (1983-2007)



$$\text{Metric} \equiv \frac{\text{abs}(\text{model} - \text{obs})}{\text{typical error}}$$



Northern Hemisphere (NH)

**LIM2: 1.33**

**LIM3: 0.43**

Southern Hemisphere (SH)

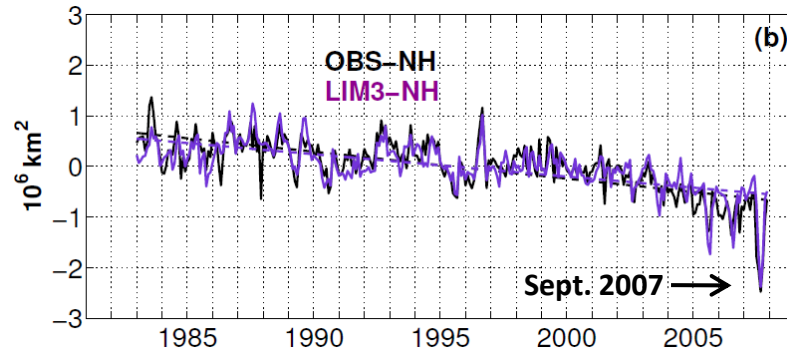
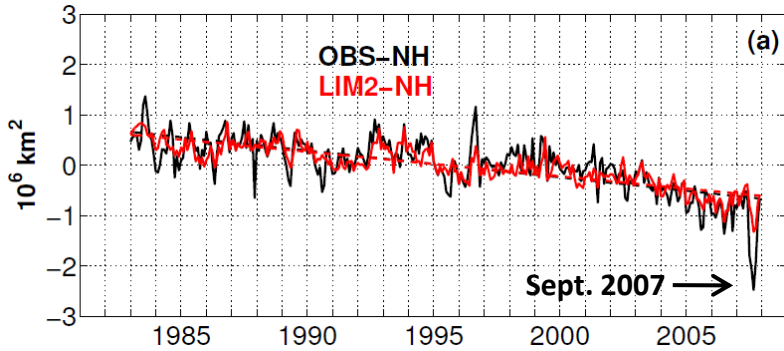
**LIM2: 3.58**

**LIM3: 1.17**

(the lower, the better)

# 1. Importance of model physics Models evaluation

## Monthly anomalies of sea ice extent (NH)



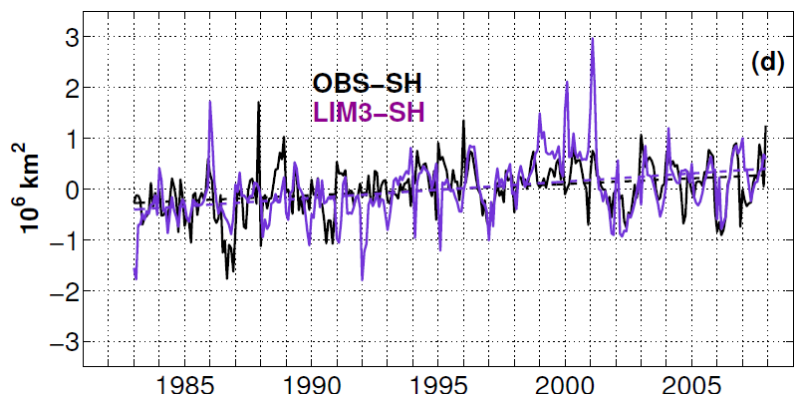
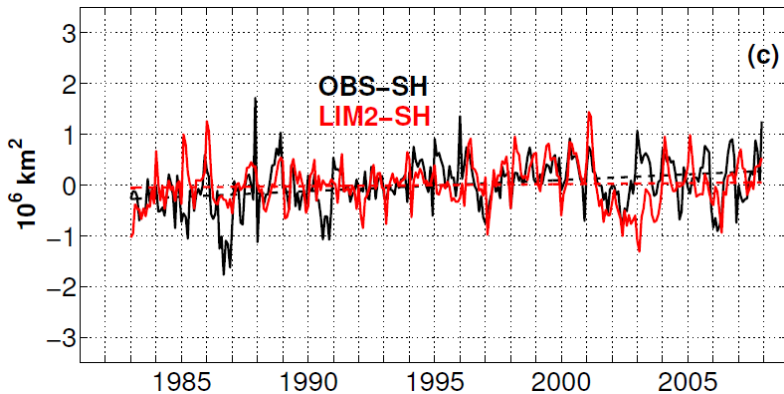
### Metrics std anomalies:

**LIM2: 1.22**

**LIM3: 0.61**

*(the lower, the better)*

## Monthly anomalies of sea ice extent (SH)



### Metrics std anomalies:

**LIM2: 0.48**

**LIM3: 1.10**

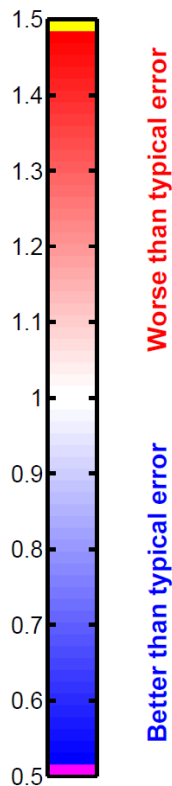
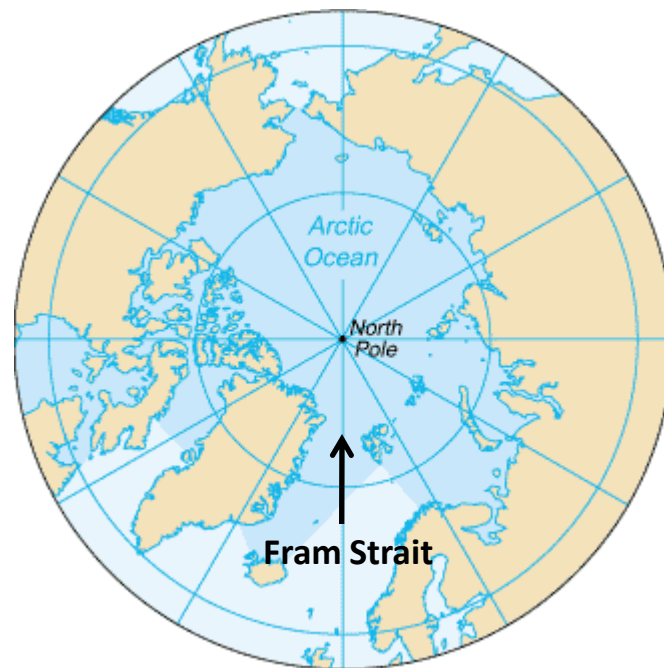
*(the lower, the better)*

# 1. Importance of model physics Discussion (NH)

## Metrics

	LIM2	LIM3	
<b>Conc.</b>	0.97	0.79	Mean
	1.03	0.77	Std of anomalies
	1.03	0.78	Trend
<b>Extent</b>	1.33	0.43	Mean
	1.22	0.61	Std of anomalies
	0.23	0.46	Trend
<b>Thick.</b>	0.94	0.67	Mean
	0.72	0.32	Trend
<b>Drift</b>	0.39	0.61	Mean kinetic energy
	0.86	0.76	Circulation pattern
<b>Fram export</b>	0.44	0.7	Mean area
	0.34	0.9	Std anomalies area
	1.14	0.82	Mean volume
	0.09	0.8	Std anomalies volume

LIM2 LIM3





# 1. Importance of model physics Discussion (NH)

## Metrics

<b>Conc.</b>	0.97	0.79
	1.03	0.77
	1.03	0.78

<b>Extent</b>	1.33	0.43
	1.22	0.61
	0.23	0.46

<b>Thick.</b>	0.94	0.67
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<b>Drift</b>	0.39	0.61
	0.86	0.76

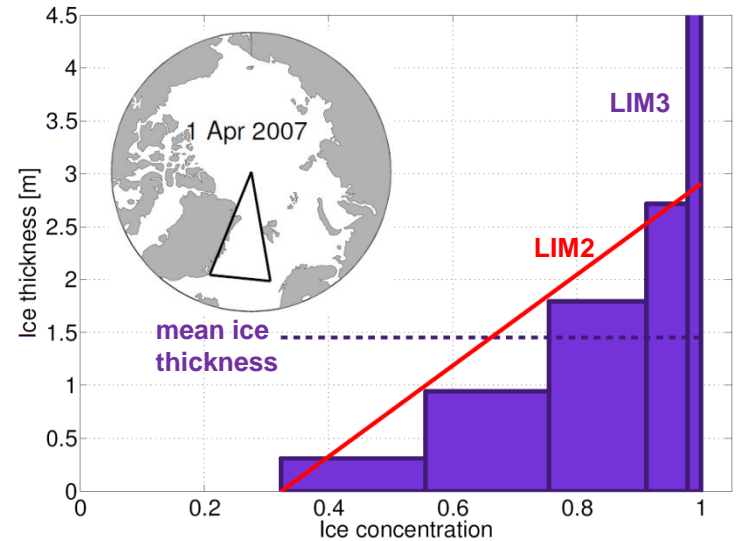
<b>Fram export</b>	0.44	0.7
	0.34	0.9
	1.14	0.82
	0.09	0.8

LIM2 LIM3

Worse than typical error

Better than typical error

- Ice thickness distribution: Metrics confirm earlier results of Bitz et al. (2001) and Holland et al. (2006) with GCMs.
- Importance of salinity variations in LIM3 (*Vancoppenolle et al., 2009*)



- Models parameters not tuned for optimizing drift
- LIM2 (VP) versus LIM3 (EVP); EVP more responsive to wind forcing (*Hunke and Dukowicz, 1997*)

# 1. Importance of model physics

## Discussion (SH)

### Metrics

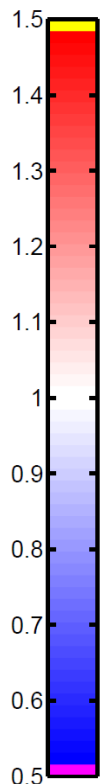
<b>Conc.</b>	1.07	1.12	Mean
	0.8	0.71	Std of anomalies
	0.92	0.94	Trend

<b>Extent</b>	3.58	1.17	Mean
	0.48	1.1	Std of anomalies
	0.9	0.52	Trend

<b>Thick.</b>	3.22	2.45	Mean
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<b>Drift</b>	1.3	1.4	Mean kinetic energy
	1.26	1.26	Circulation pattern

**LIM2 LIM3**

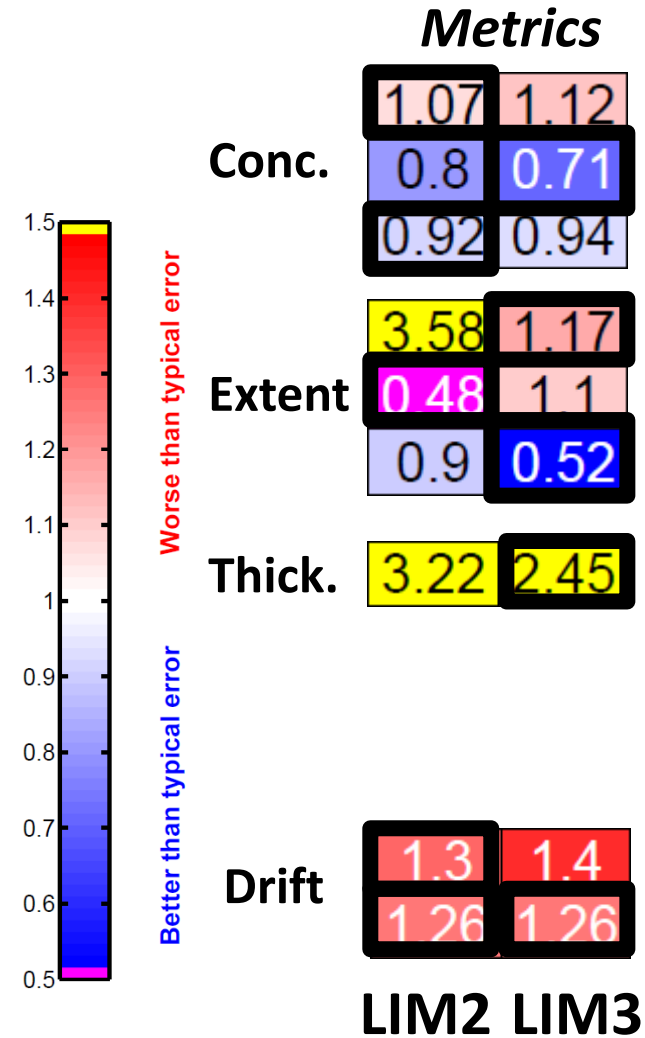


Worse than typical error

Better than typical error



# 1. Importance of model physics Discussion (SH)



- No outstanding model!

- SH is different from NH in many respects:

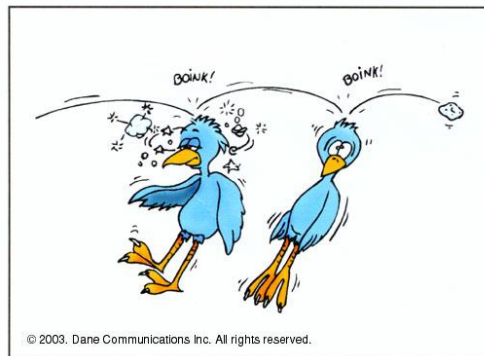
- Dynamics of the Southern Ocean and unresolved small-scale processes (Rintoul et al., 2001)

- Quality of the reanalyses (Vancoppenolle et al., 2010; Vihma et al., 2002; Timmerman et al., 2004)

- Thinner ice than NH

## 2. Sea-ice data assimilation

*Can we partly overcome the systematic biases of LIM2?*



## 2. Sea-ice data assimilation

# An EnKF approach

The Ensemble Kalman Filter (Evensen, 2003)

$$\mathbf{x}^a = \mathbf{x}^f + \mathbf{K} (\mathbf{d} - \mathbf{H} \mathbf{x}^f)$$

**Analysis** (orange arrow pointing to  $\mathbf{x}^a$ )

**Forecast** (daily, LIM2, ORCA2) (blue arrow pointing to  $\mathbf{x}^f$ )

**Kalman gain** (Includes obs. error and model forecast error covariance matrices) (red arrow pointing to  $\mathbf{K}$ )

**Observations** (Global, daily sea-ice concentrations 1979-2005 (OSISAF, 2010)) (green arrow pointing to  $\mathbf{d}$ )

**Projection** (Interpolation model-observation grids) (purple arrow pointing to  $\mathbf{H}$ )

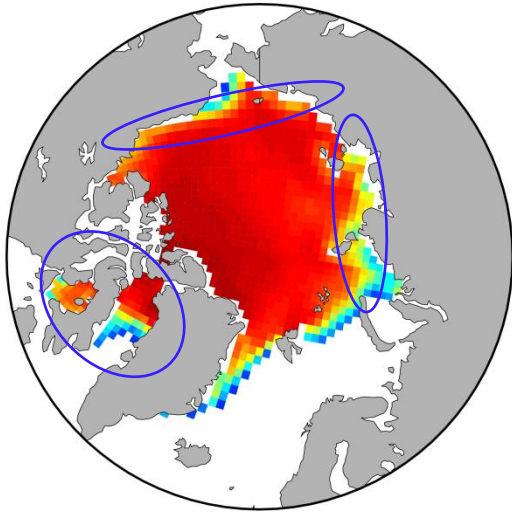
- Observational errors: ➡ provided with the sea-ice concentration products
- Model forecast errors: ➡ 25 members, gaussian wind perturbations

- ✓ EnKF is statistically consistent
- ✓ Multivariate data assimilation

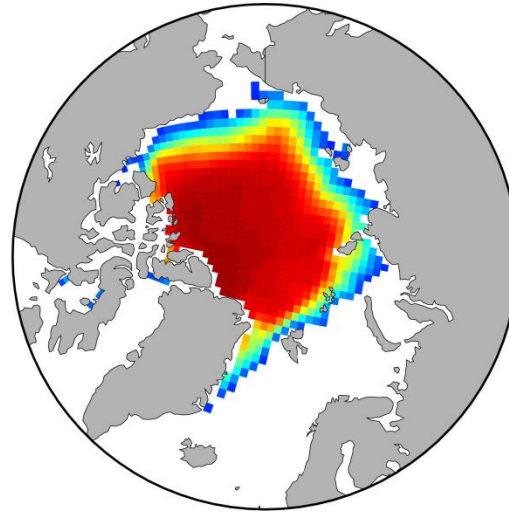
## 2. Sea-ice data assimilation

# Direct improvements

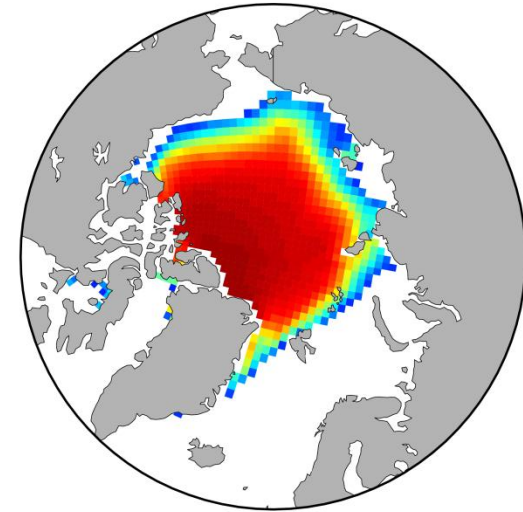
*Mean September 1983-2005 sea-ice concentrations*



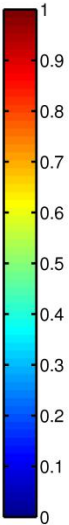
LIM2 - FREE



OBS



LIM2 - ASSIM



« [...] 15 minutes before he died,  
he was still alive [...] »

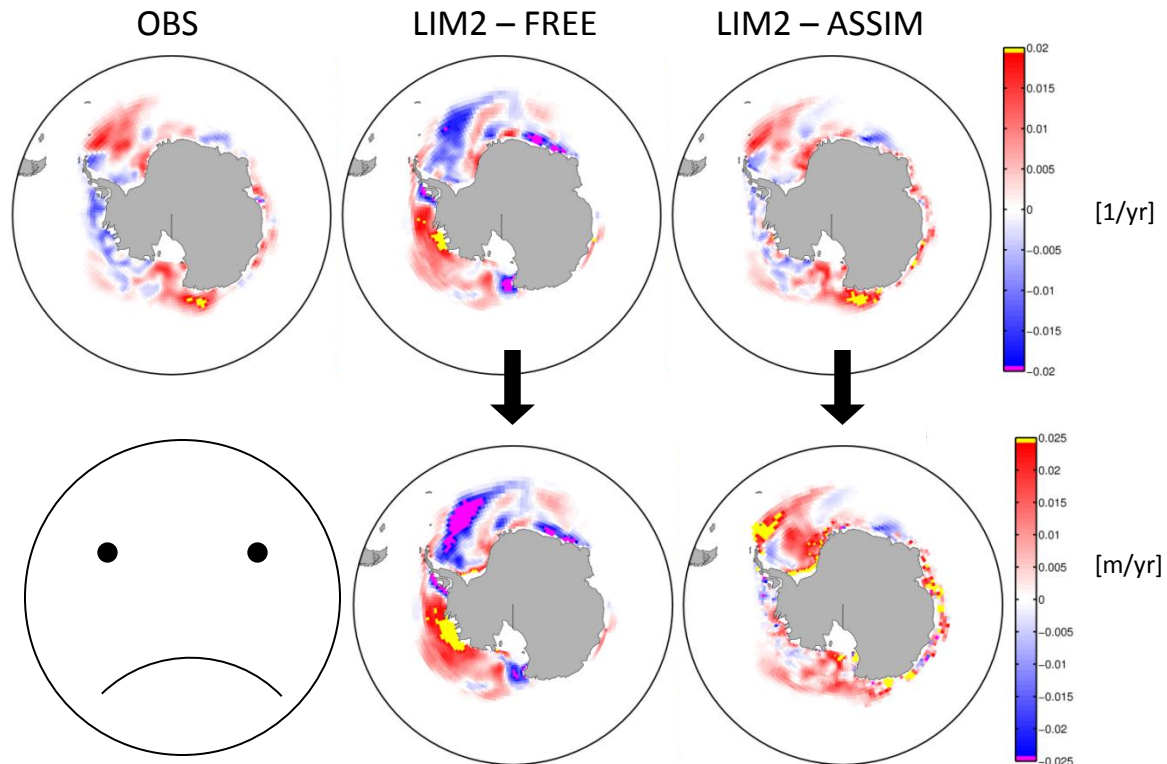
Monsieur de La Palisse (~ 1500)

## 2. Sea-ice data assimilation

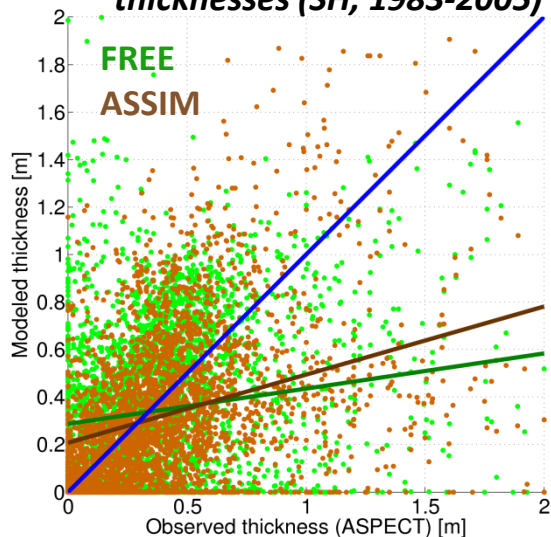
# Side effects

Trends in sea-ice concentration in January (1983-2005) →

Trends in sea-ice thickness in January (1983-2005) →

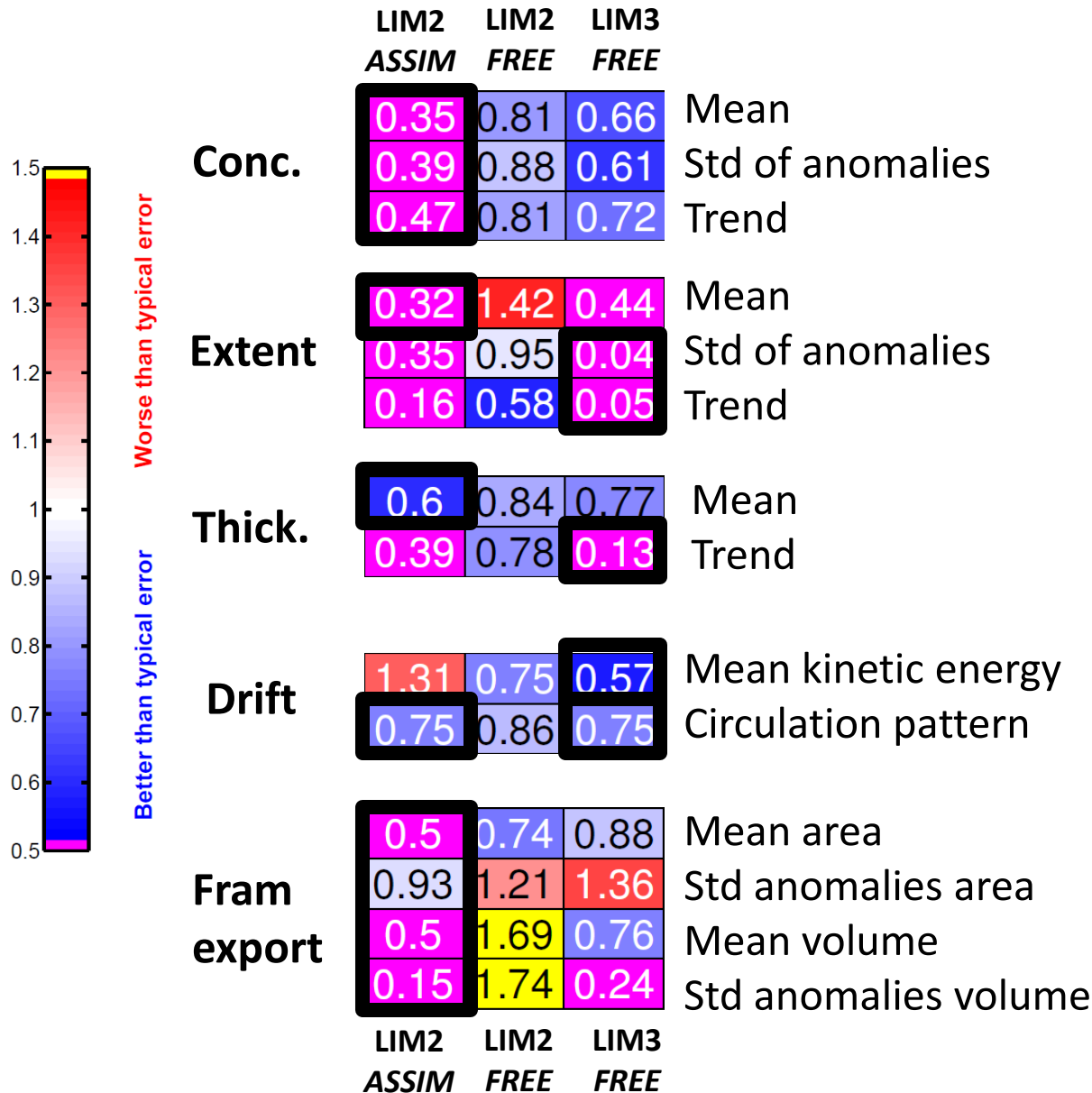


**Modeled versus observed sea-ice thicknesses (SH, 1983-2005)**



- Assimilation of sea-ice concentration **only**
  - improves trends in sea-ice concentration
  - has a high effect on the simulated trends of sea-ice thickness
  - slightly improves the simulated sea-ice thickness

## 2. Sea-ice data assimilation Evaluation (NH)



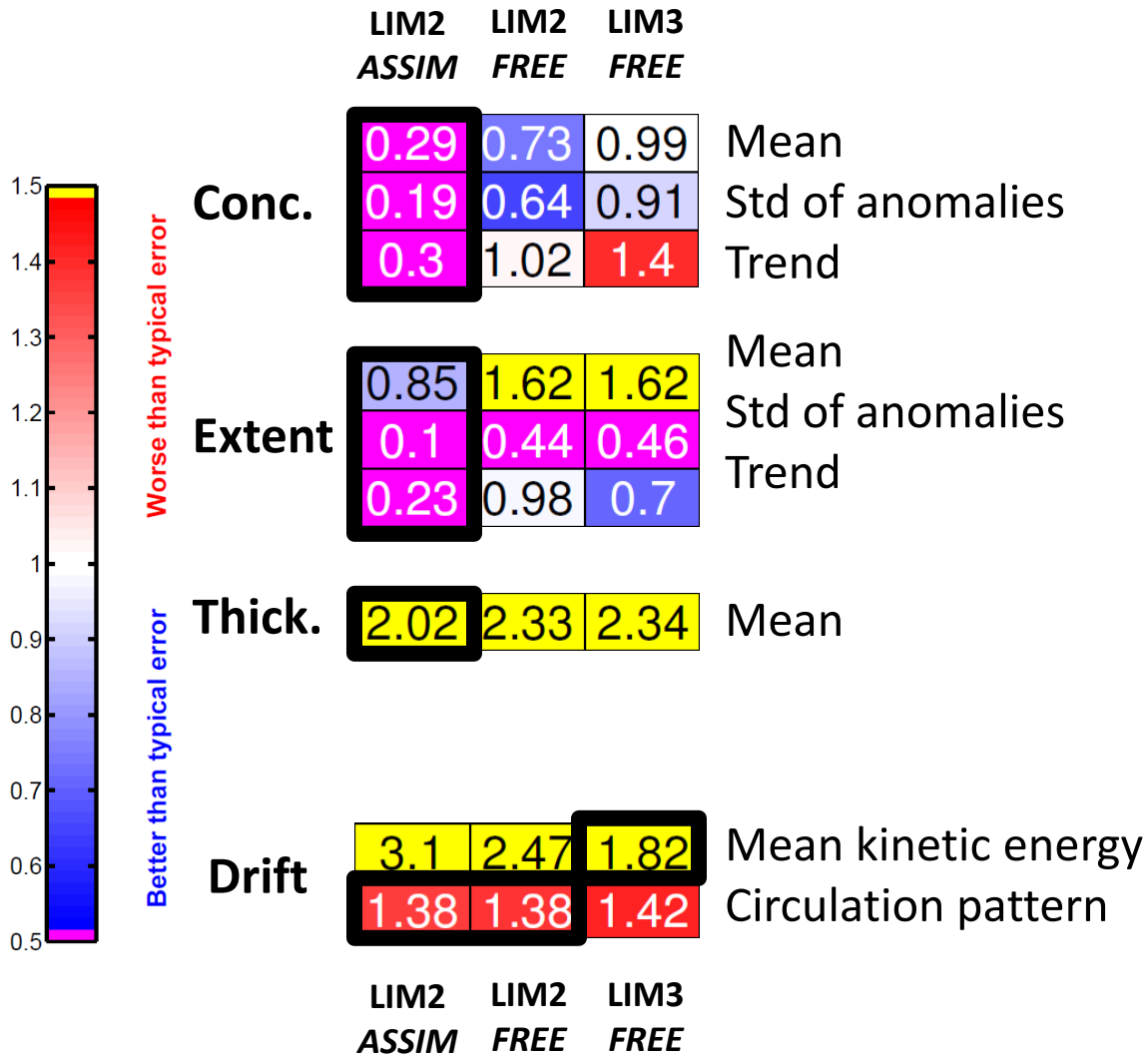
(the lower, the better)

### In the NH

- Assimilation of ice concentration → right mean state
- Model physics are still crucial to reproduce interannual variability
- Impact of assimilation on dynamics is not clear
- Integrated quantities (Fram) better reproduced



## 2. Sea-ice data assimilation Evaluation (SH)



(the lower, the better)

### In the SH

- Assimilation of sea-ice concentration takes over model physics, for mean state **and** interannual variability
- Impact of assimilation on dynamics is not clear
- Better regional representation of ice concentration

# Take home message

- The sea-ice models LIM2 and LIM3 show
  - different skills in the NH (mainly due to model physics)
  - similar, lower skill in the SH (mainly due to external factors)
- Data assimilation of sea-ice concentration in LIM2
  - efficiently corrects the model biases in sea-ice concentration
  - slightly improves the simulated sea-ice thickness
  - provides a continuous set of initial conditions (COMBINE, WP6) to be coupled with NEMOVAR ocean initial conditions
- Data assimilation of sea-ice freeboard in Arctic (2005-2007)
  - Recent satellite data have also been assimilated (*Mathiot et al., in prep.*)
  - Main changes occur at the centre of the ice pack

	Obs. : Kwok et al. (2009) [ $10^3 \text{ km}^3$ ]	LIM2– <b>no assim.</b> [ $10^3 \text{ km}^3$ ]	LIM2– <b>ice conc. assim.</b> [ $10^3 \text{ km}^3$ ]	LIM2– <b>ice conc. and freeboard assim.</b> [ $10^3 \text{ km}^3$ ]
Central Arctic sea-ice volume in March–April 2007	16.5	23.5	18.6	17.5