

# Progress and Plans, Issues and Opportunities

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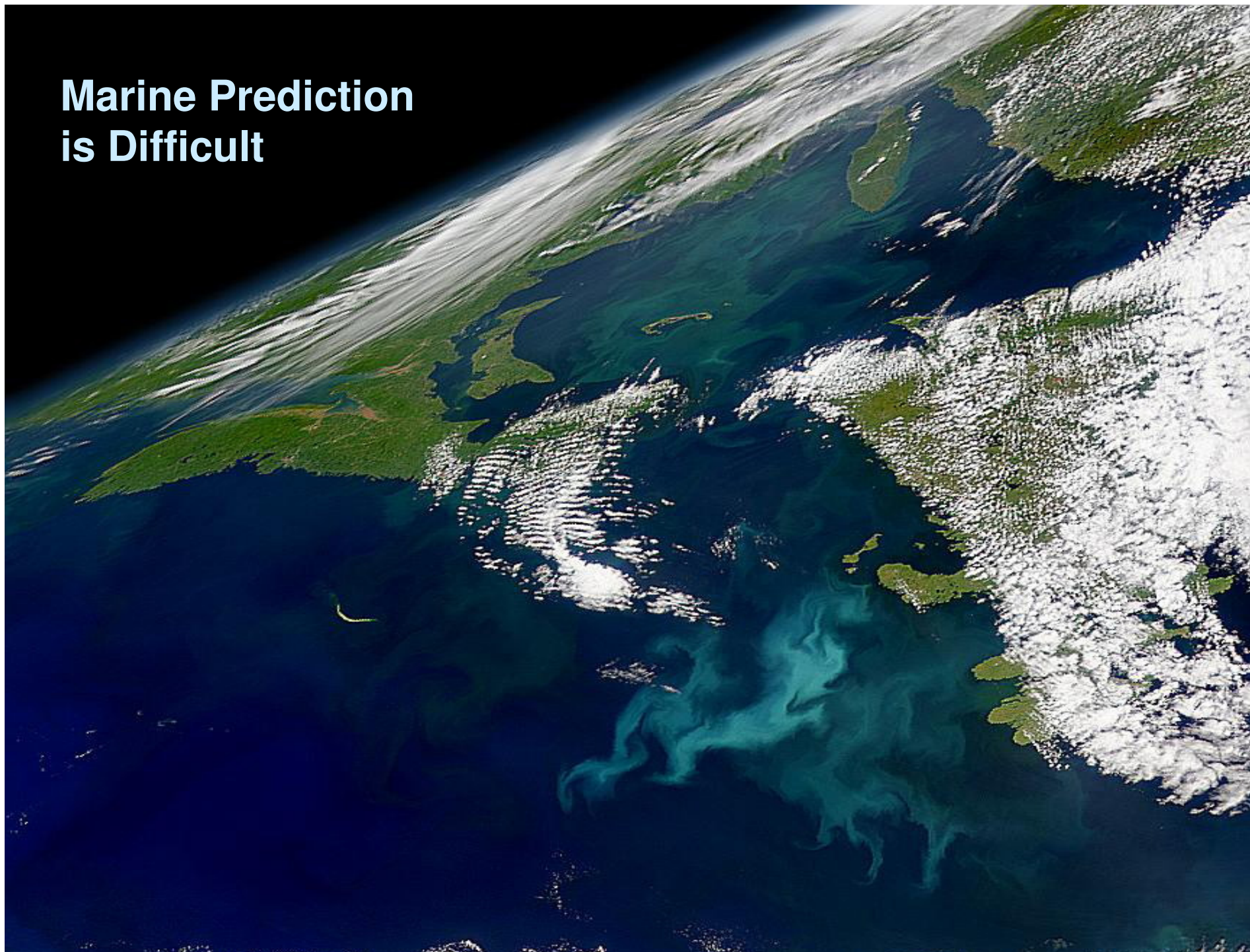
Canadian Foundation for Climate  
and Atmospheric Sciences (CFCAS)

Fondation canadienne pour les sciences  
du climat et de l'atmosphère (FCSCA)

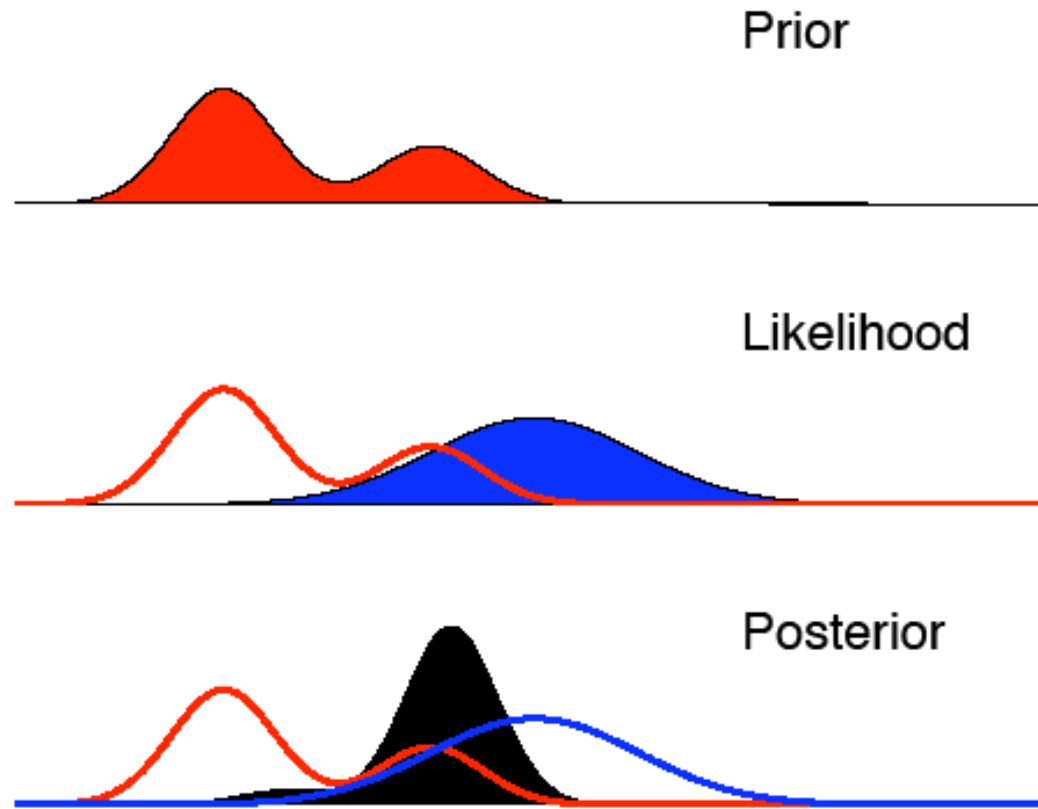
# Applications of a Coupled Atmosphere-Ocean Forecast System

- Sustaining a healthy and productive marine environment through ecosystem modeling and informed fisheries management
- Short term forecasting of currents and sea ice for search and rescue, navigation, ship routing and pollution containment
- Short term forecasting of maritime weather such as hurricanes and “bomb” storms, and accompanying storm surges and flooding
- Assist Canadian exercises and operations in regions of strategic interest (e.g., the Arctic Archipelago)
- Providing multi-season and multi-year climate predictions to assist with planning of seasonally dependent economic activities such as agriculture, oil refining, hydro-electric generation and transportation

# Marine Prediction is Difficult



# Managing Uncertainty: The Need for Data Assimilation



# GOAPP in a Nutshell

- CFCAS research network, close to \$3 Million from CFCAS
- In-kind (EC, DFO, DND) ~ \$975 k/yr over 4 years
- Objective: Improve forecasts of the coupled atmosphere-ocean system on time-scales of days to decades, and space scales of tens of kilometers to global
- Outcomes: Better models and assimilation schemes, a deeper understanding of contributors and limits to predictability
- Complements the EC-DFO-DND Canadian Operational Network of Coupled Environmental Prediction Systems (CONCEPTS) and EC's operational seasonal forecast activity

# Structure of the Research

Two themes distinguished by time-scale:

**Theme I:** Days to Seasons

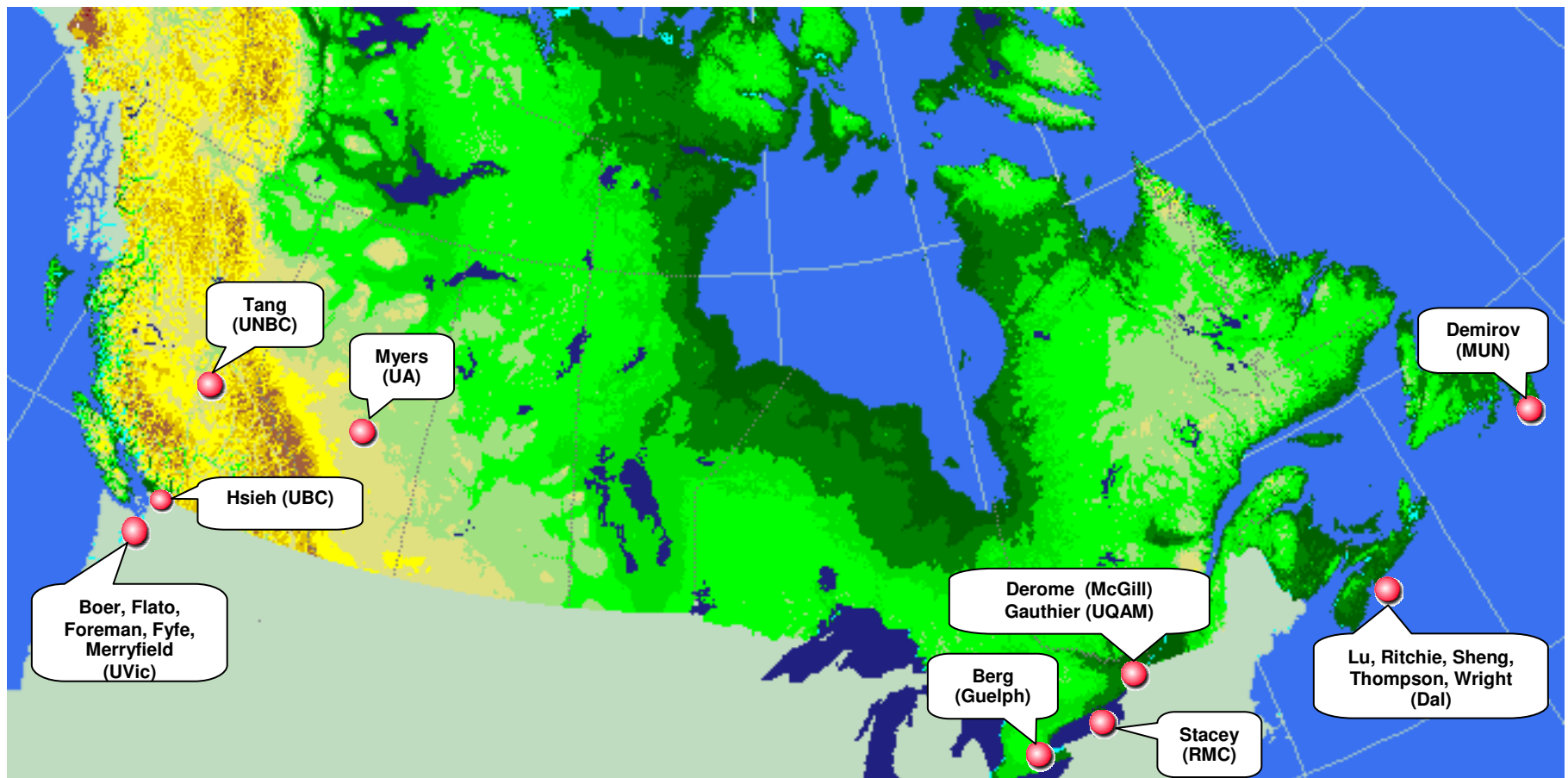
**Theme II:** Seasons to Decades

These two themes reflect:

- ❑ Present expertise in weather and climate modelling and prediction in Canada
- ❑ Potential advantages of a multi-model approach

Working toward a ***seamless prediction capability*** that bridges these time-scales (consistent with developing international activities e.g. THORPEX, WCRP)

# Geographical Distribution of the 18 GOAPP Co-Investigators

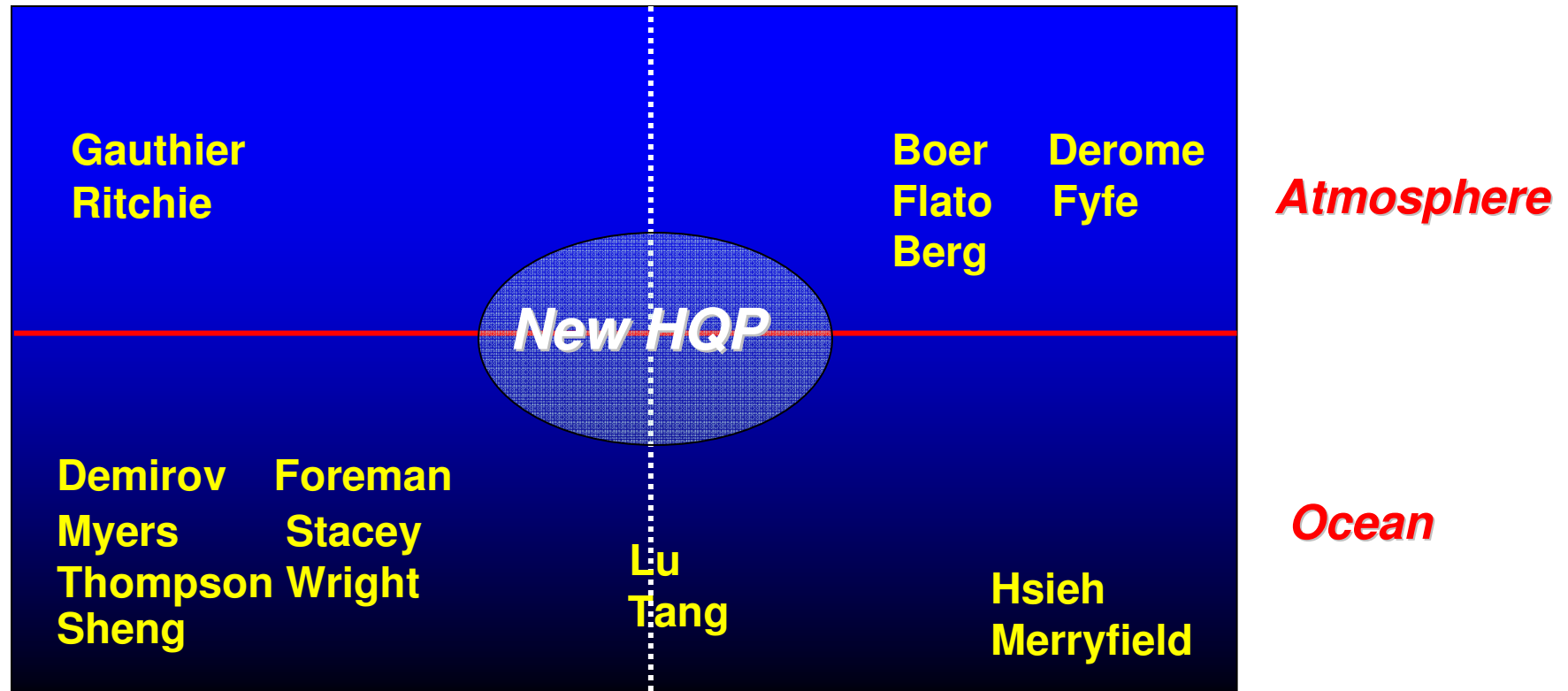


20 Collaborators from EC and DFO

# The GOAPP Researchers

*Days to Seasons*

*Seasons to Decades*





# Highly Qualified Personnel

<b>Trainees</b>	<b>2009</b>	<b>Anticipated Total</b>
Research Associates	7	8
Post Doctoral Fellows	5	6
PhD	6	12
Masters	9	17
Undergraduates	2	7
<b>Total</b>	<b>29</b>	<b>50</b>

# Theme I Projects: Days to Seasons

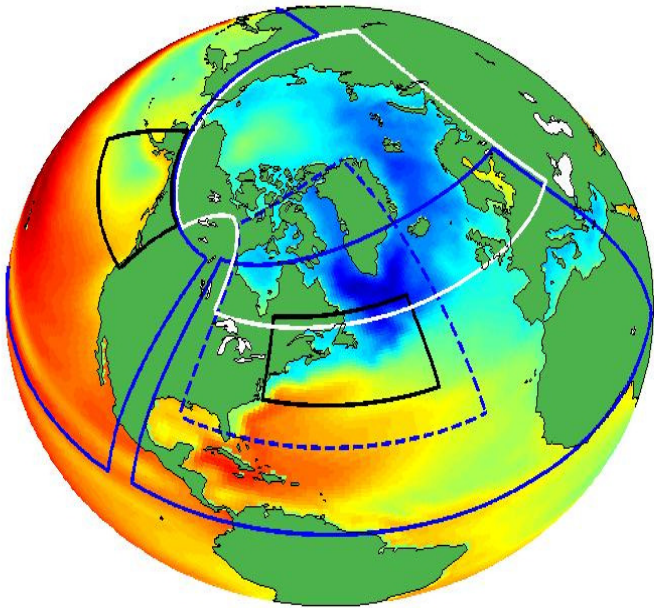
## Ocean Modeling and Data Assimilation

- **Suppression of bias and drift in ocean model components**
- **Statistics of observed variability for model testing and improvement**
- **Multivariate assimilation of altimeter and Argo data**
- **Ocean reanalysis and forecasting**
- **Modelling and assimilation of sea ice**
- **Assessing the capability of a nested-grid shelf circulation model for the Eastern Canadian Shelf**

## Coupled AO Modeling and Data Assimilation

- **Assimilation into coupled atmosphere-ocean models**
- **Studies on joint assimilation into coupled models**

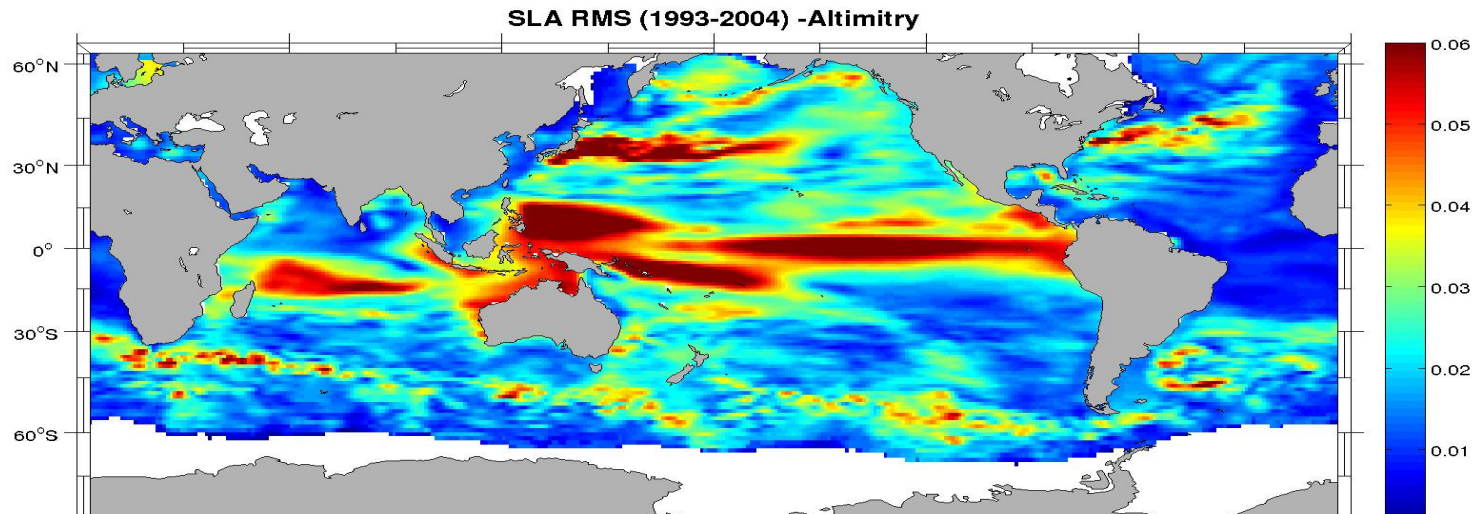
# Theme I: Ocean Modelling and Assimilation



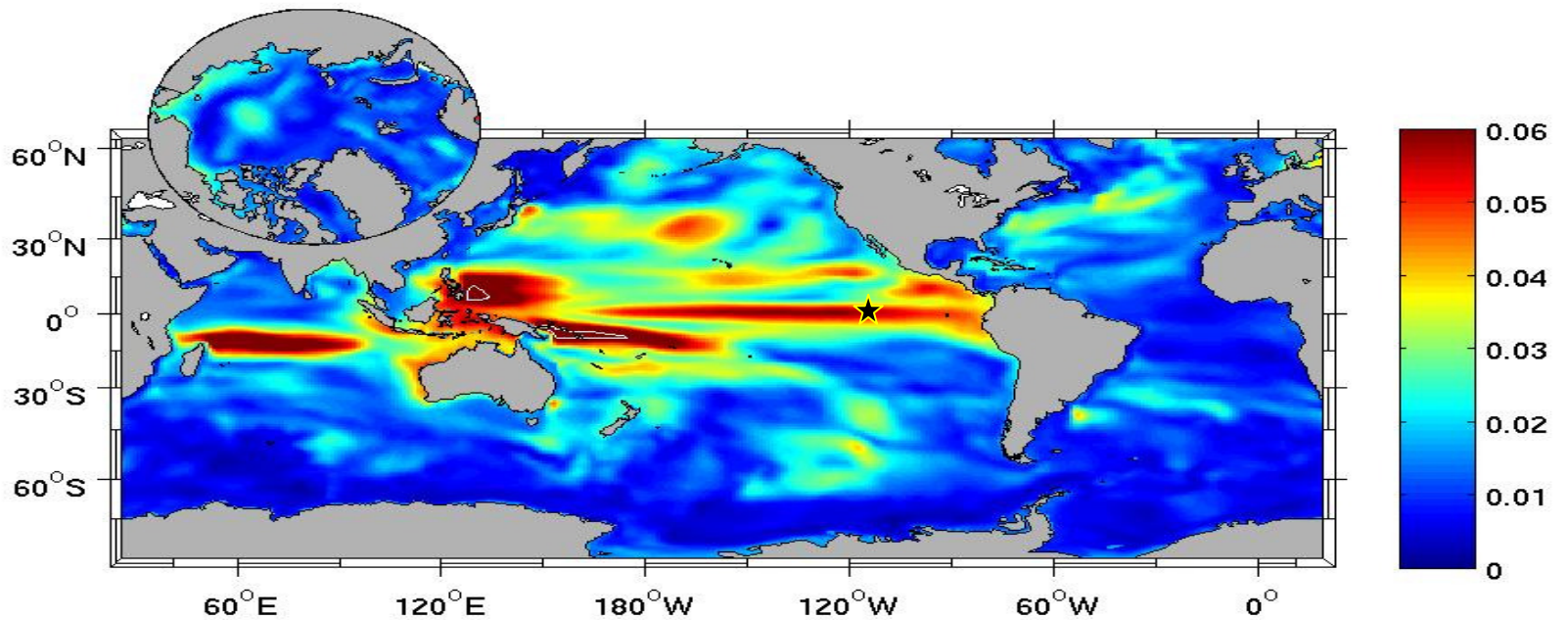
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# Inter-Annual Sea-Level RMS 1993-2004 (m)

Obs

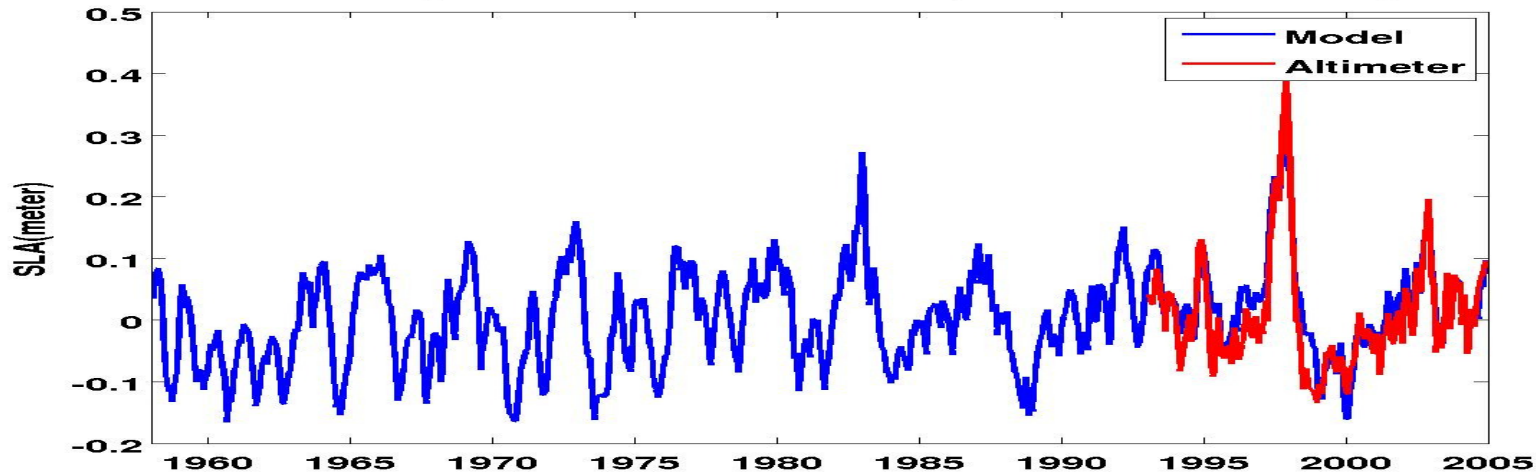


Model

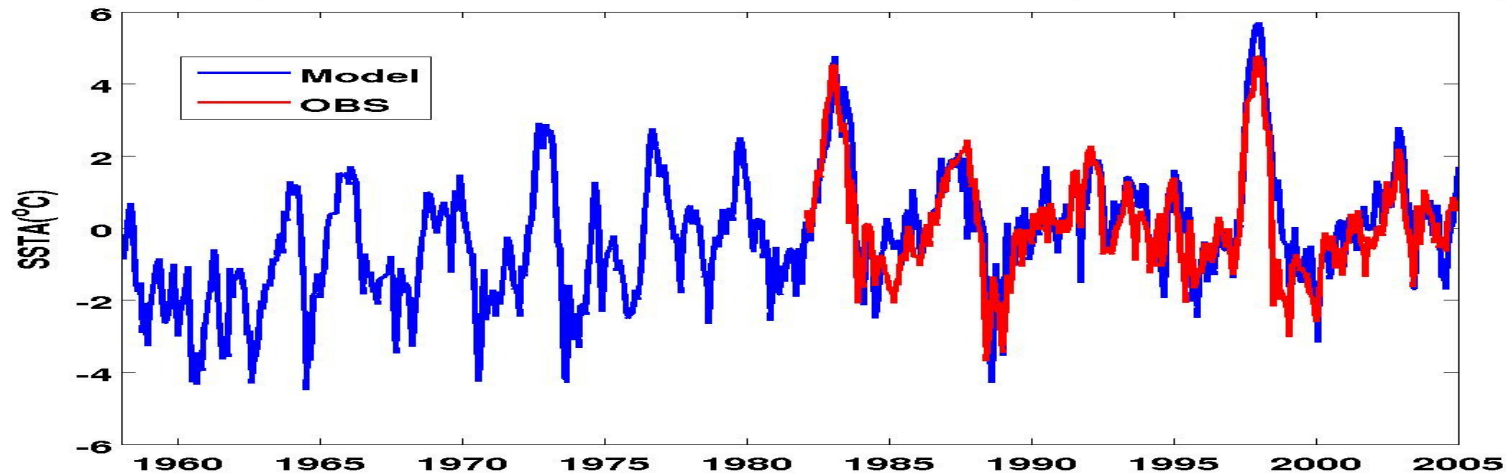


# Tropical Pacific Variability

Monthly SLA at 120W 0 N(Eastern Pacific)

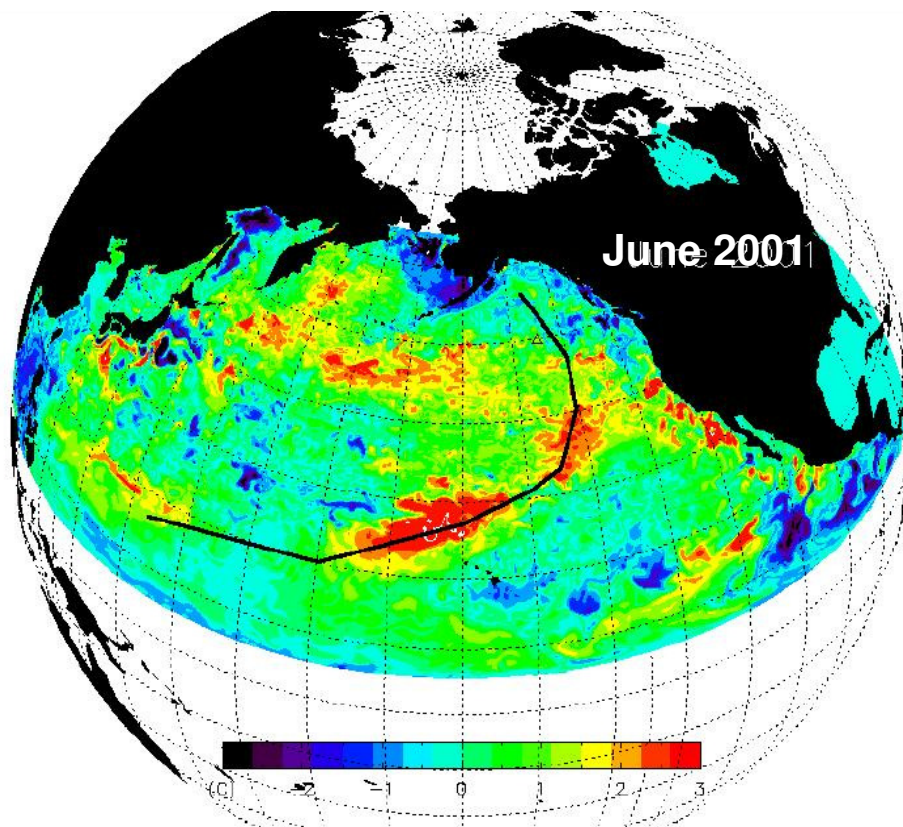


Monthly SST anomalies at 120W 0 N(Eastern Pacific)



**SSH and SST in the equatorial Pacific are well simulated WITH REANALYSIS ATMOSPHERIC FORCING.**

# Potential Predictability in North Pacific SST

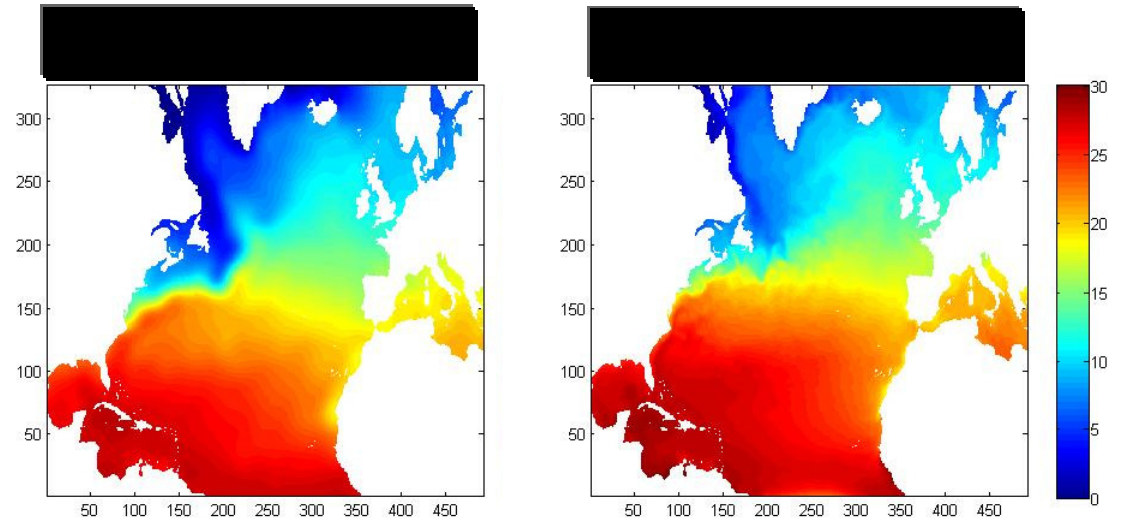
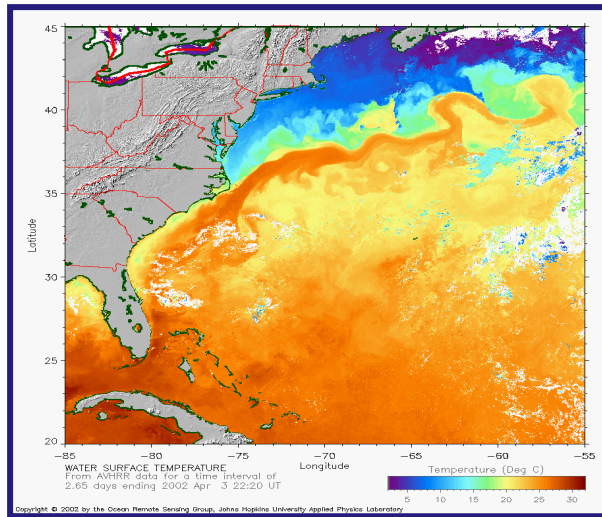


Black line shows theoretical position of Rossby wave front, generated at the coast 3y earlier by ENSO event.

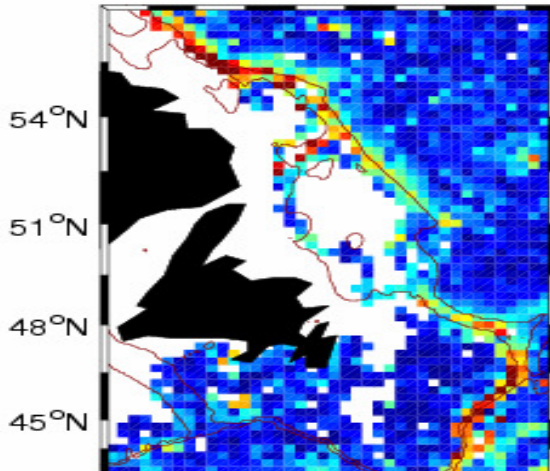
Note correspondence of the black line with maxima in the simulated SST anomaly.

For example, Rossby waves take 3-5y to propagate from coast to OWSP, implying predictability in the northeast Pacific.

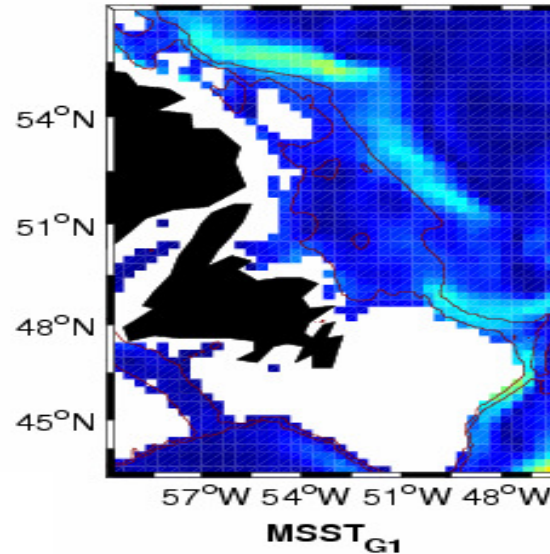
# Gulf Stream separation problems



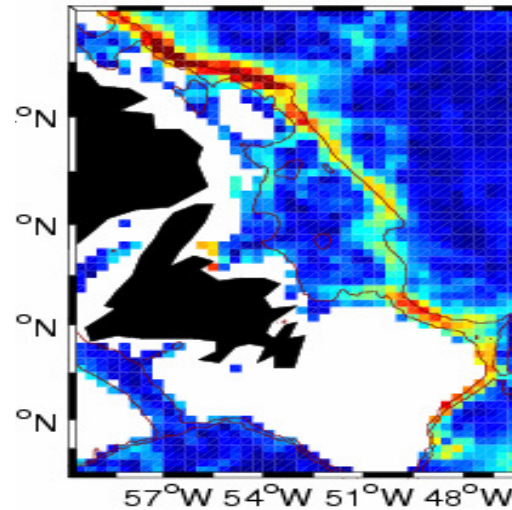
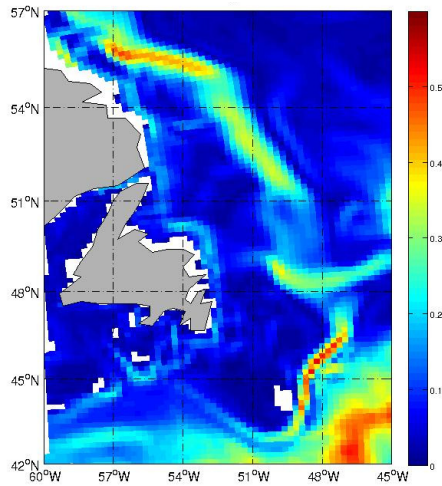
**Drifters: the benchmark**



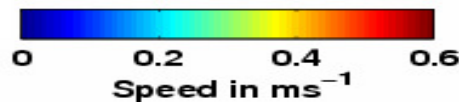
**Old nudged model result**



**New nudged model result**



**Satellite-based  
result**



The old nudged model results have currents significantly too weak in the sub-polar gyre. The new result is significantly improved in spite of greatly reduced nudging.



# 2-way nesting using AGRIF

A regional modelling strategy

**Coarse resolution  
large-scale model**

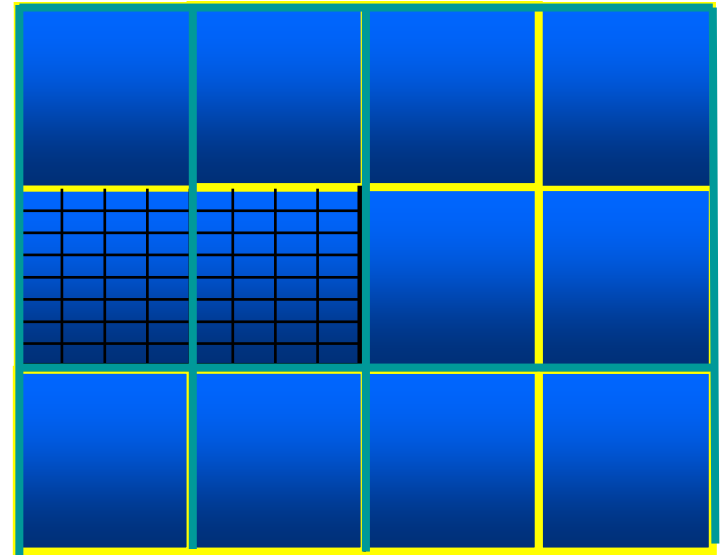


Interpolate to provide  
initial and boundary  
condition control



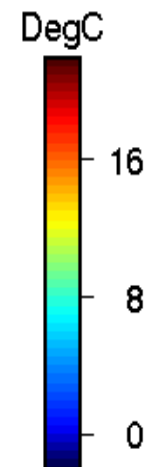
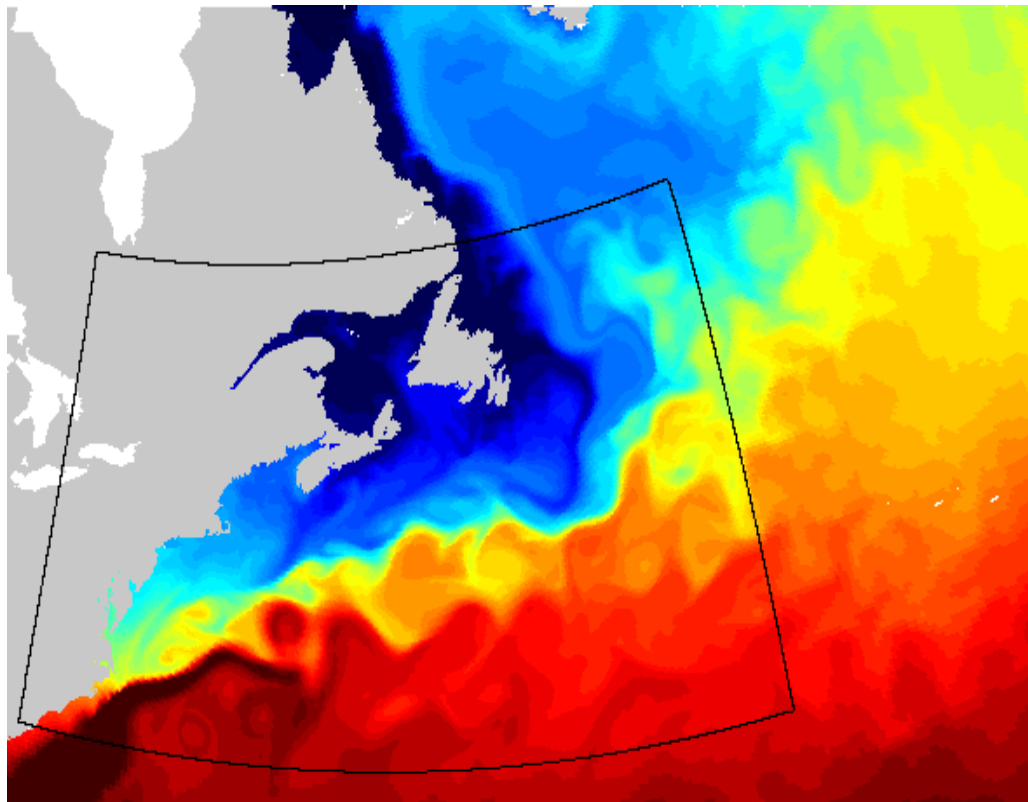
**Finer  
resolution  
regional model**

Fine  
grid



Coarse  
grid

# AGRIF test of $\frac{1}{4}$ degree NA with a $\frac{1}{12}$ degree embedded “Gulf Stream region”



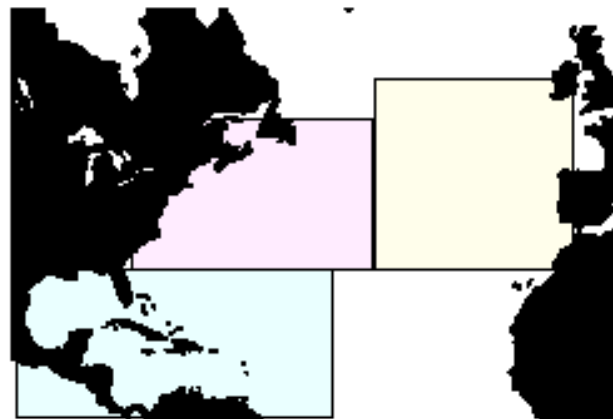
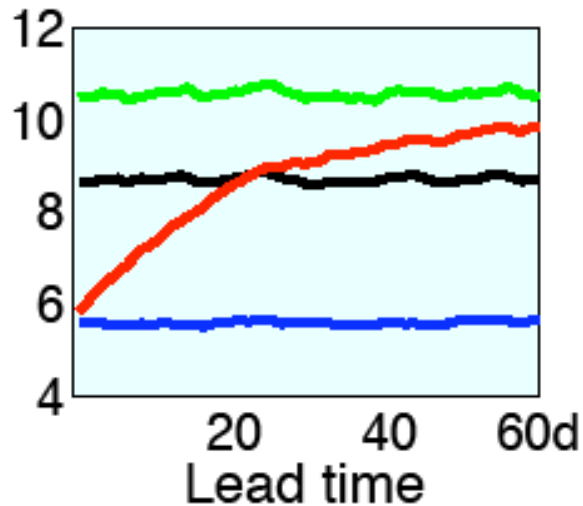
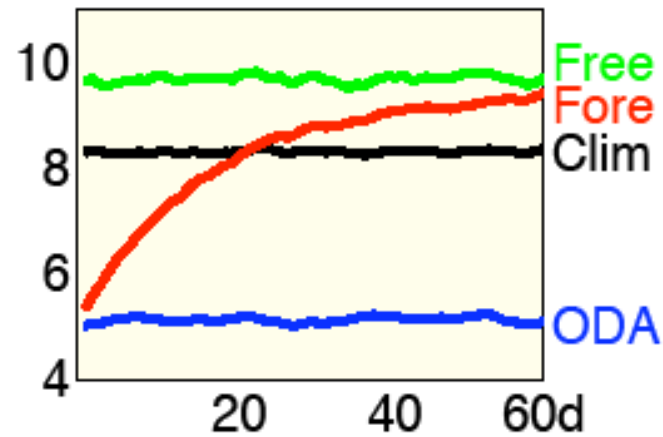
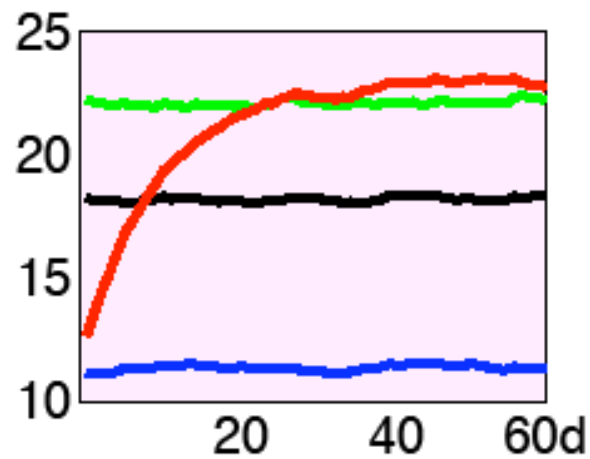
This surface temperature illustrates results after 9 years of prognostic integration with no nudging. Major problems commonly occur within the first 5 years.

More work is needed but this is a major step forward.

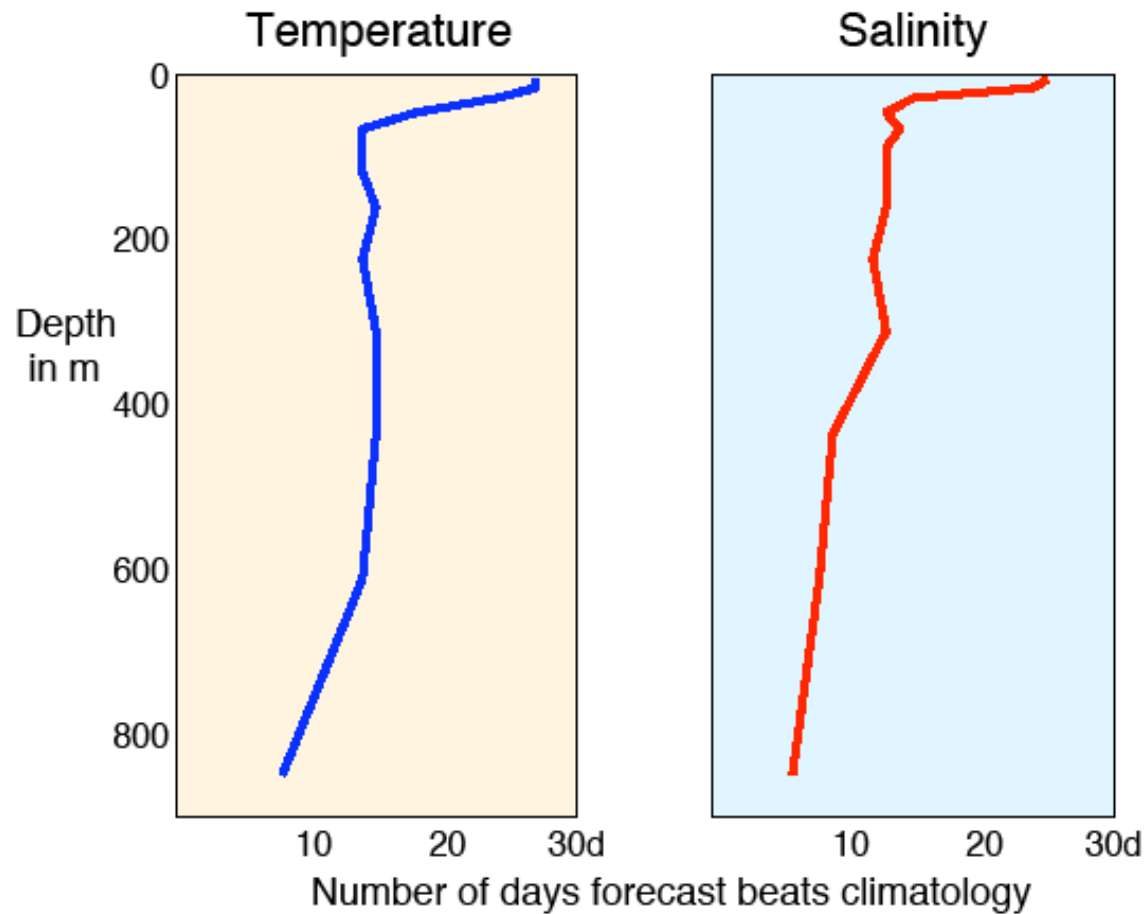
# Assimilating Altimeter and ARGO Data: North Atlantic Example

- 1/3 degree ocean model with 23 levels.
- Daily atmospheric forcing from NCEP reanalysis.
- Assimilate Argo and altimeter data, 2003-5.
- 3D-Var extension of Cooper-Haines method.
- The DA scheme is both evolutive and efficient.

# Forecast Skill For Sea Level



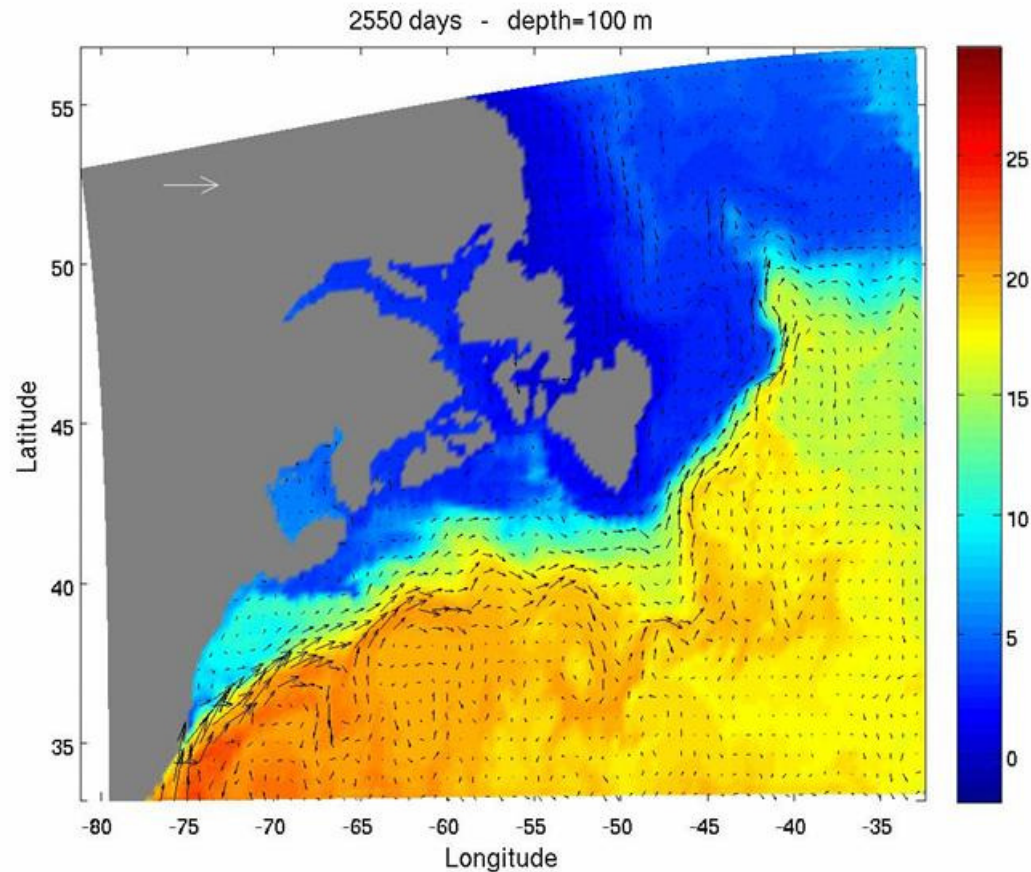
# Forecast Skill for Temperature and Salinity



# Downscaling from Ocean to Shelf

**Objective:** to develop a high-resolution (1/12 degree), 3D shelf circulation model for the eastern Canadian shelf to be embedded within a larger-scale (1/4 degree) model of the North Atlantic Ocean.

Subsurface (100 m) temperatures from 1997 to 1999 produced by the outer sub-model of the nested-grid shelf circulation system for the eastern Canadian shelf



# Independent Assimilation into Coupled Atmosphere Ocean Models

- ✓ **Data assimilation into a coupled model raises new issues.**
- ✓ **Recent work focused on parameter estimation to improve heat, momentum and moisture exchange between atmosphere and the ocean. Anticipate significant improvements in quality of the analyses.**
- ✓ **EC is coupling GEM to Mercator's NEMO ocean system.**
- ✓ **Incremental formulation being developed by GOAPP: independent assimilation for ocean and atmosphere observations in an "inner loop" but full coupled model integration.**

# **Joint Assimilation into Coupled Atmosphere Ocean Models**

**Using observations from either the atmosphere or ocean to simultaneously update both**

**Initial work focused on covariance between atmosphere and ocean state variables – in CCCma coupled model and NCEP reanalyses.**

**Interesting results from Redundancy Analysis:**

- Clearer, more robust patterns of co-variability**
- Identification of causal relationships to guide joint data assimilation.**

**Simplified coupled state space model being used to test innovative strategies for joint data assimilation**



# GOAPP Theme II Projects: Seasons to Decades

## Analysis and Mechanisms

- ❑ Pacific Decadal Oscillation
- ❑ Southern and Northern Annular Modes

*What are the origins of predictability?*

## Predictability of the Coupled System

- ❑ Potential Predictability Of Current And Future Climates
- ❑ Prognostic predictability from ensembles of coupled model simulations

*What are the limits of predictability?*

## Prediction

*“Climate forecasting”*

- ❑ Coupled Model Initialization
- ❑ The Coupled Model Historical Forecasting Project
- ❑ Forecast Combination, Calibration and Verification
- ❑ Sensitivity of Climate Forecasts to Initialization of Land Surface

*How well can we predict in practice?*

Theme I  Ocean bias correction for climate forecasts

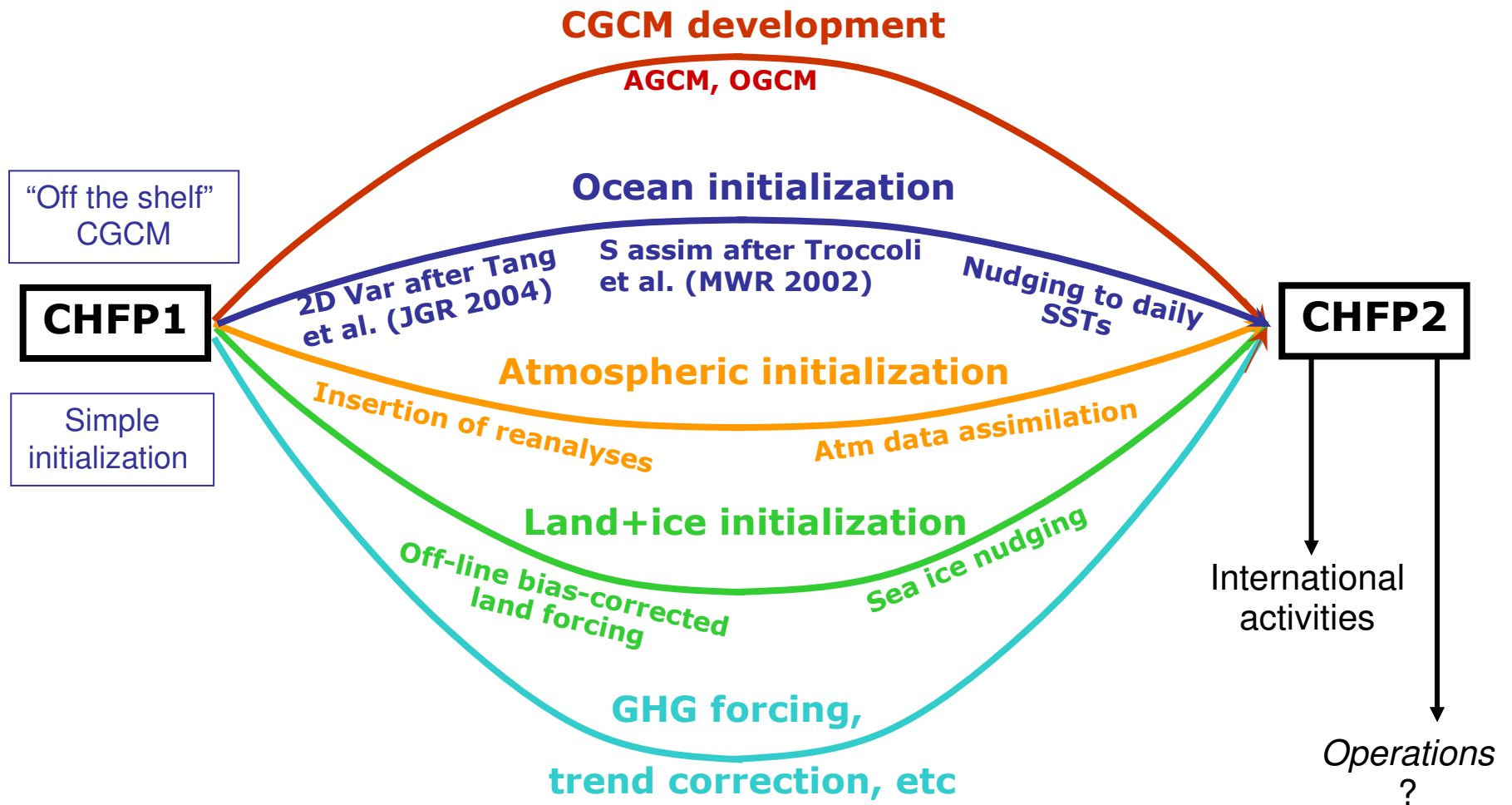
# Climate forecast horizons

timescale	sources of predictability
Subseasonal ~15-60 days	Madden-Julian Oscillation Land surface “memory”
Seasonal to interannual ~2 months-2 years	El Niño-Southern Oscillation (ENSO)
Interannual to Multidecadal ~2-20 years	Atlantic Multidecadal Oscillation
Multidecadal to Centennial ~20-100 years	Anthropogenic forcing trends

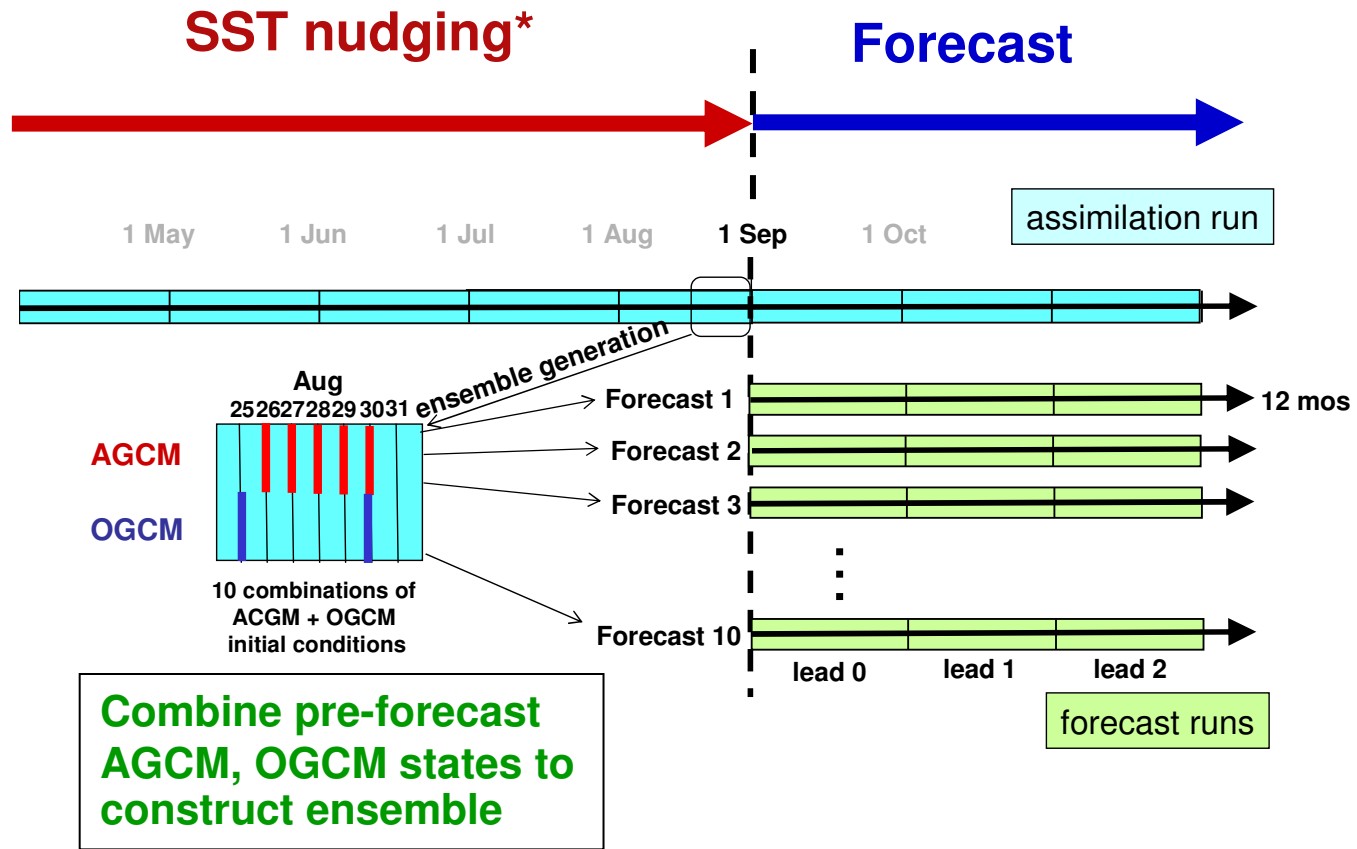
# Climate forecasting in Canada

- **Current operational system** based on **HFP2**:
  - 4 AGCMs (AGCM2, AGCM3, SEF, GEM)
  - ensemble size 4×10
  - Two-tier: persisted SSTA
  - 4 month forecasts
  - statistical model used at longer leads
- **GOAPP**→ **develop one-tier forecast system**
  - Future SSTs *predicted* as part of forecast → *potential for skill at much longer leads*
  - Requires coupled climate model

# The Coupled Model Historical Forecasting Project (CHFP)



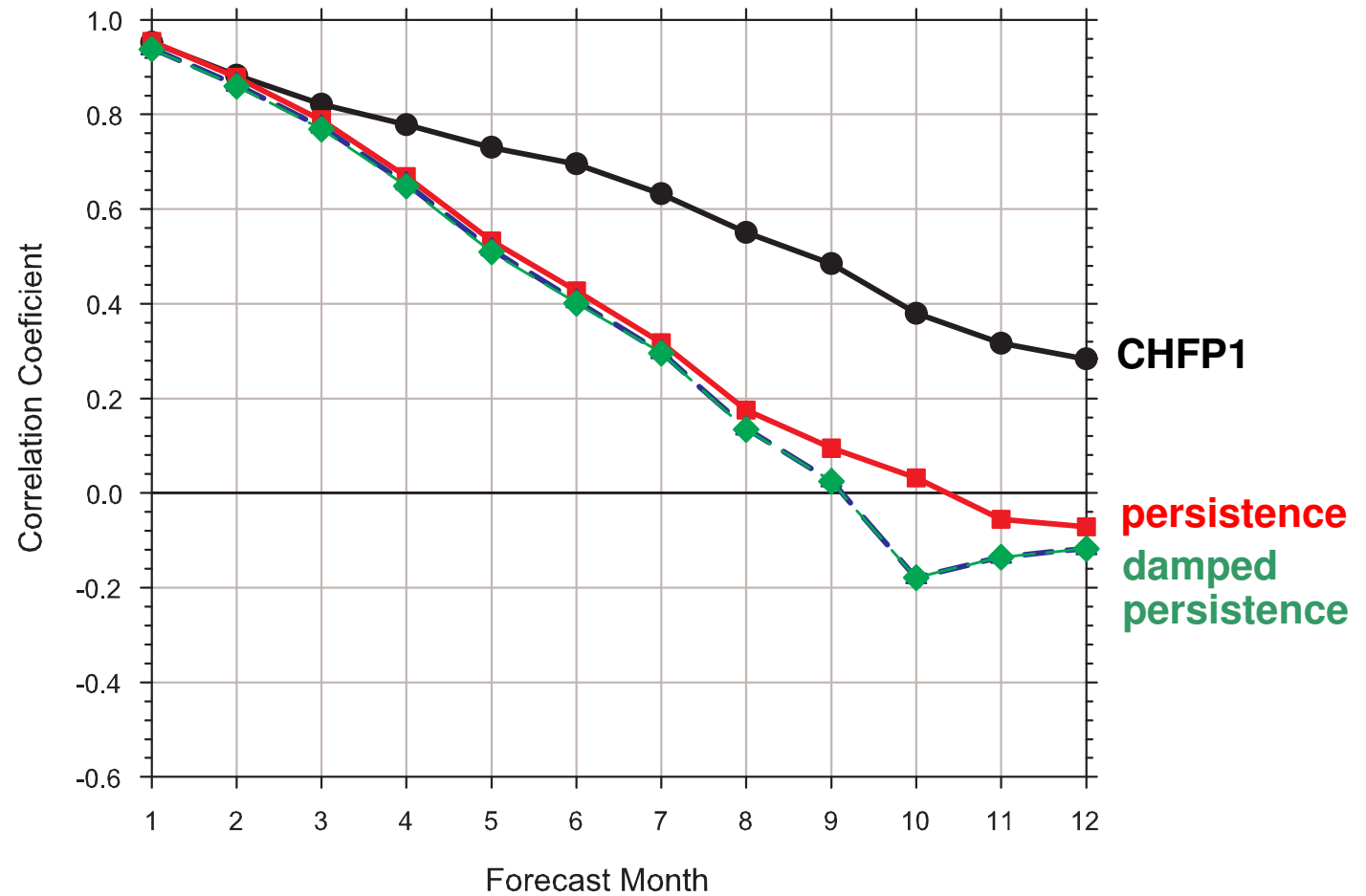
# CHFP1 initialization



*\*simplest procedure demonstrated to have much skill*

# CHFP1 results

Anomaly correlation skill score: Nino3.4 index  
All seasons 1972-2001

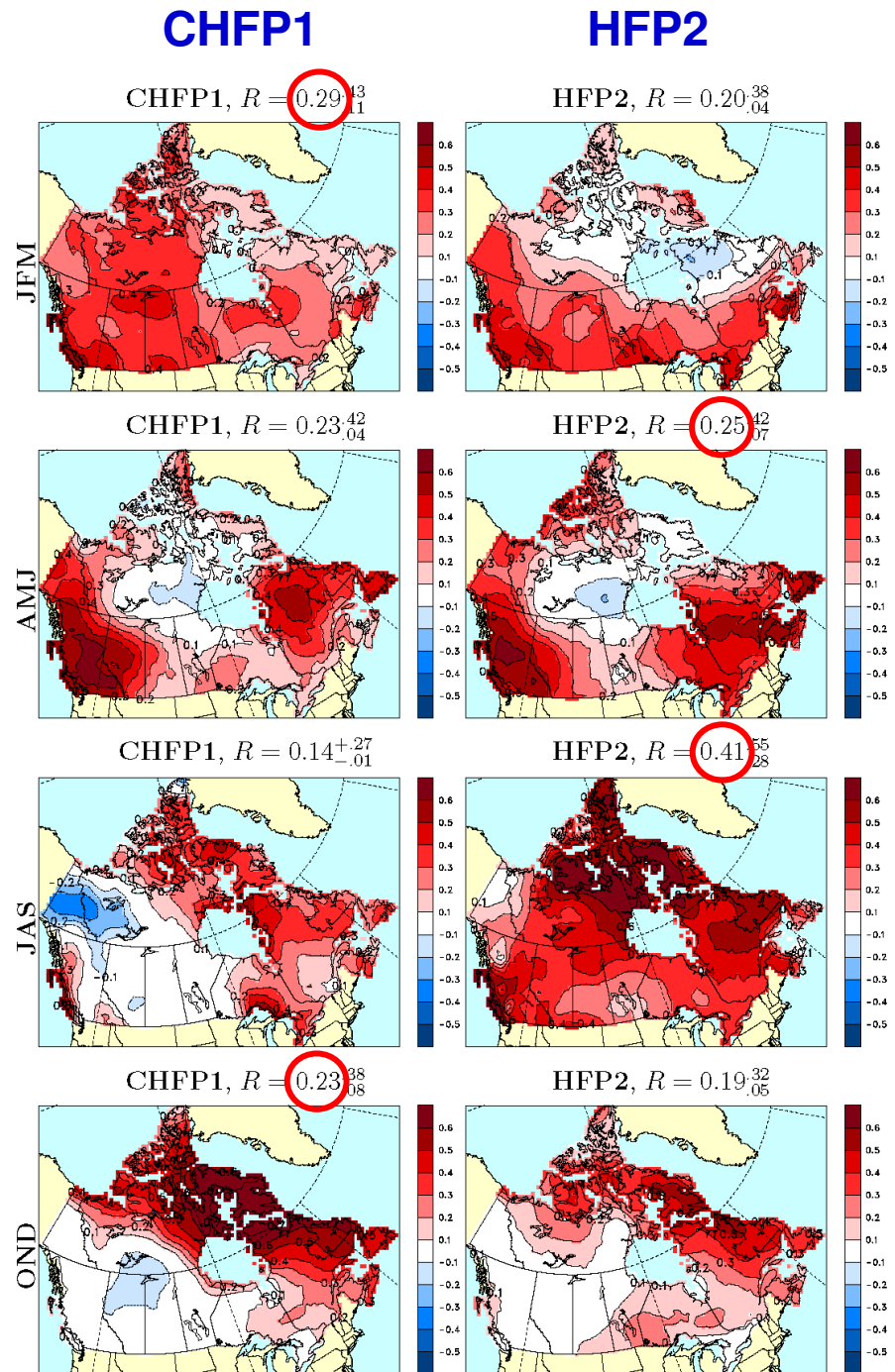


# CHFP1 vs HFP2

Correlation skill  
Surface air temperature  
over Canada  
1-month lead

→ CHFP1 competitive with two-tier HFP2 despite smaller ensemble size

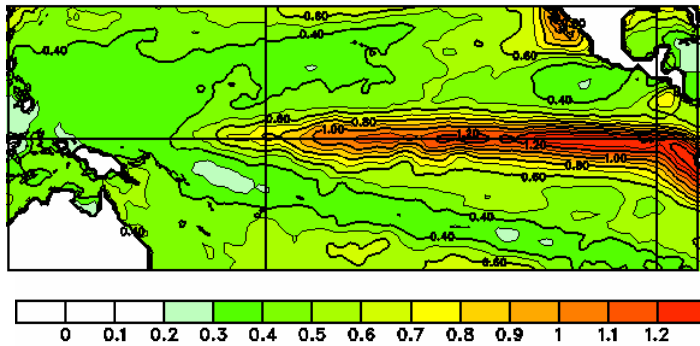
Merryfield, W. J., W.-S. Lee, G. J. Boer, V. V. Kharin, B. Pal, J. F. Scinocca and G. M. Flato, 2009: The first Coupled Historical Forecasting Project (CHFP1). *Atmosphere-Ocean*, submitted.



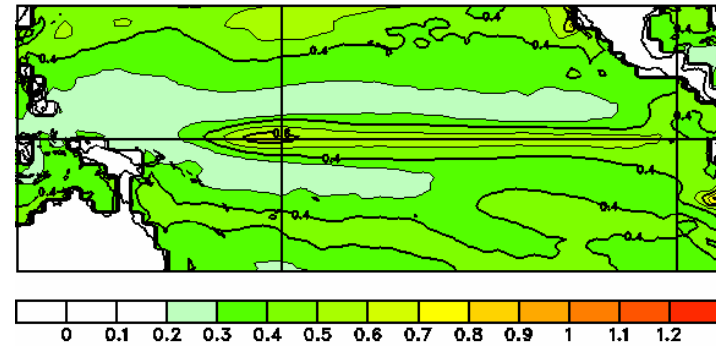
# Model improvements: ENSO

Monthly SSTA standard deviation

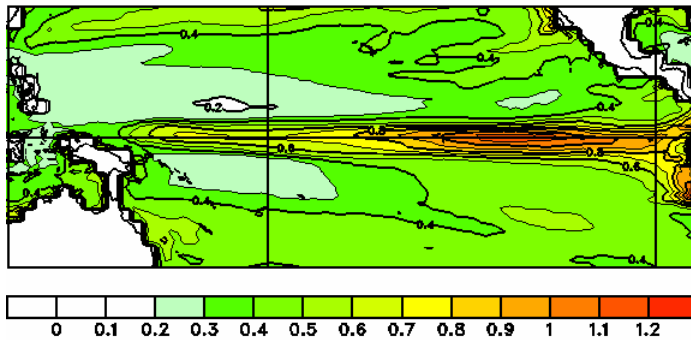
Observations:  
HadISST 1970-99



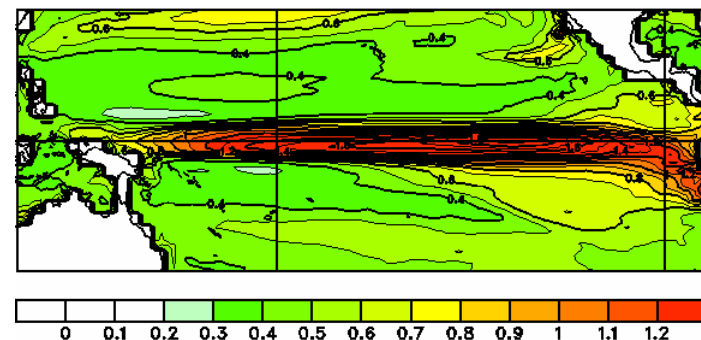
AGCM3+OGCM3  
CHFP1



AGCM3+OGCM4  
CHFP2<sub>1</sub>



AGCM4+OGCM4  
CHFP2<sub>2</sub>



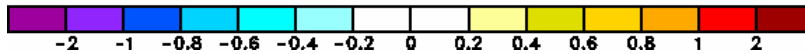
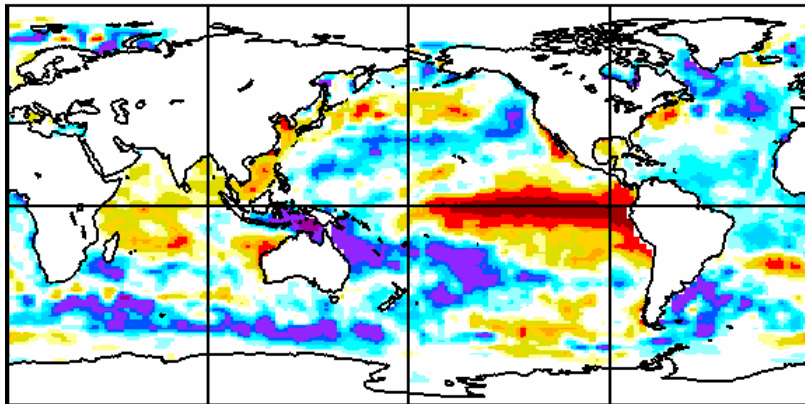
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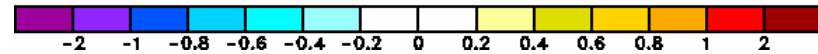
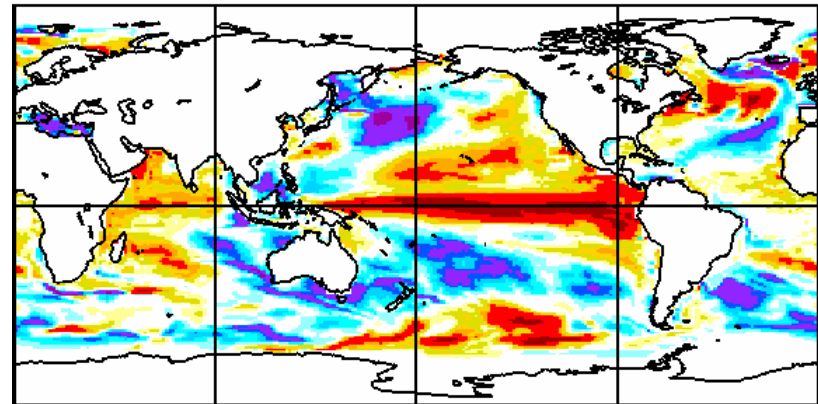
# Impact of model improvements

- Illustration: 1982/83 El Niño, 11 month lead

Obs SSTA Nov 1982



Forecast SSTA Nov 1982  
AGCM4 + OGCM4 Lead=11 mo



- While such “hits” not always possible (even in theory), a *strong El Niño is now within the range of possibilities that can be forecast*

# Impact of Model improvements on ENSO Prediction

	OGCM AGCM	Ens size	Avg skill
CHFP2	OGCM4 + AGCM3	1	0.55
	OGCM4 + AGCM4	1	0.64
CHFP1	OGCM3 + AGCM3	1	0.48
	OGCM3 + AGCM3	10	0.60

Mean NINO3.4 correlation skill of rolling 3-month forecasts

Dec → Nov

Mar → Feb

Jun → May

Sep → Aug

**SST nudging only** 1972-2001

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N=1 CHFP2 skill exceeds N=10 CHFP1 skill

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→ *much room for further improvement through ensembles & better initialization*

Mean NINO3.4 correlation skill of rolling 3-month forecasts

Dec → Nov

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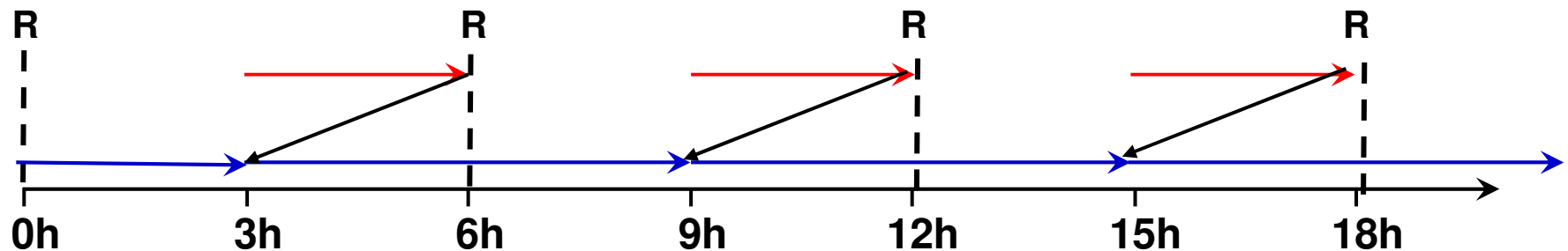
SST nudging only 1972-2001

# Atmospheric Data Assimilation

## Incremental Reanalysis Update (IRU) assimilation:

- run model freely for 3h (“forecast”) to reanalysis time R
- difference with reanalysis → “centered” increments  $\Delta\mathbf{x}^a$
- rewind
- rerun for 6h adding analysis increments as forcing to model equations:

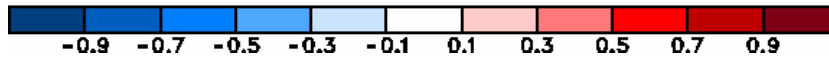
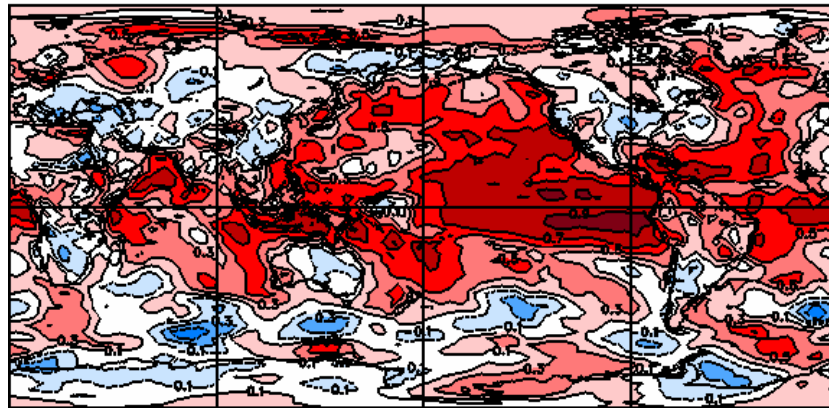
$$\frac{d\mathbf{x}}{dt} = M(\mathbf{x}) + h(t)\Delta\mathbf{x}^a$$



# Impacts of AGCM assimilation: Improved 1<sup>st</sup> month skill

Surface temperature correlation skill  
First forecast month from 1 Sep 1980-2001

SST nudging only

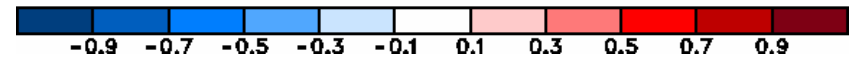
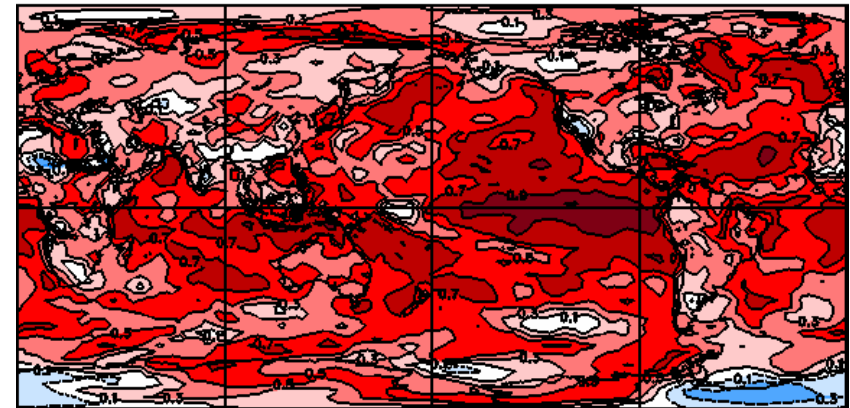


GLOBAL: 0.29

LAND: 0.09

OCEAN: 0.37

SST nudging + AGCM assimilation



GLOBAL: 0.51

LAND: 0.33

OCEAN: 0.58

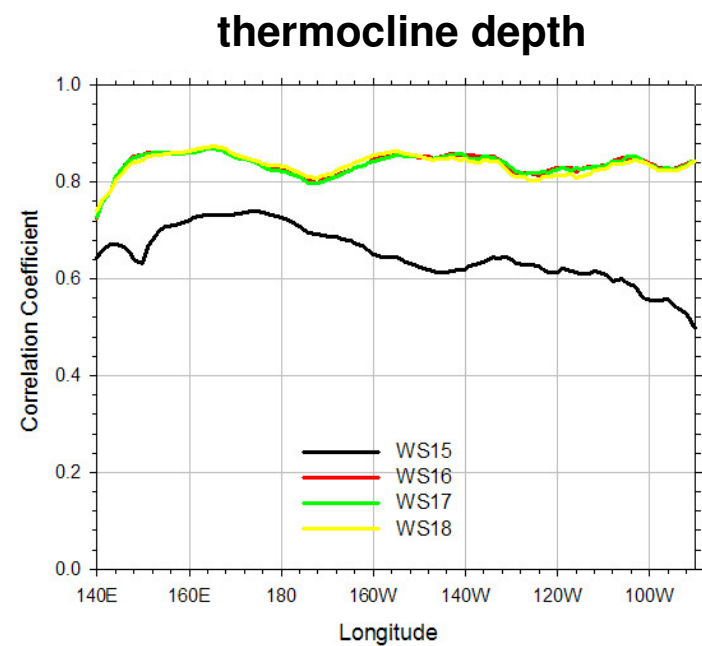
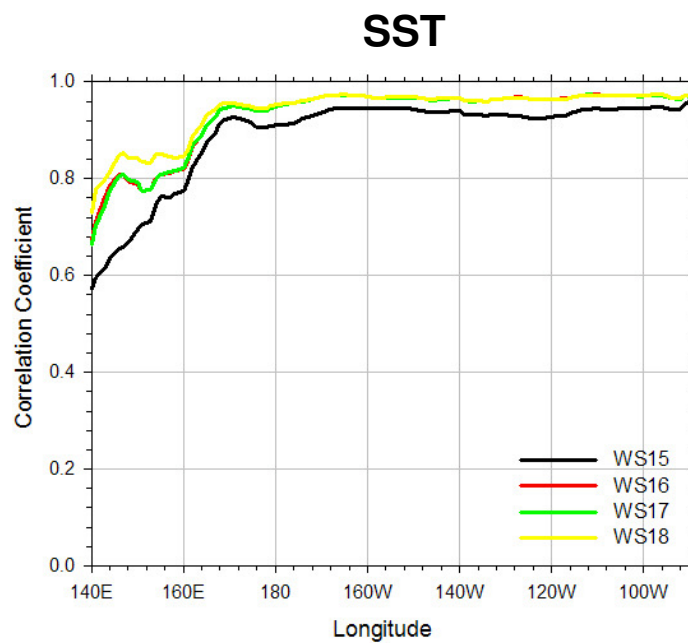


# Impacts of AGCM assimilation: Improved ocean initialization

Correlation coefficients vs obs: equatorial Pacific (5S-5N)

colours: SST nudging + AGCM assimilation

black: SST nudging only



# Ocean Data Assimilation

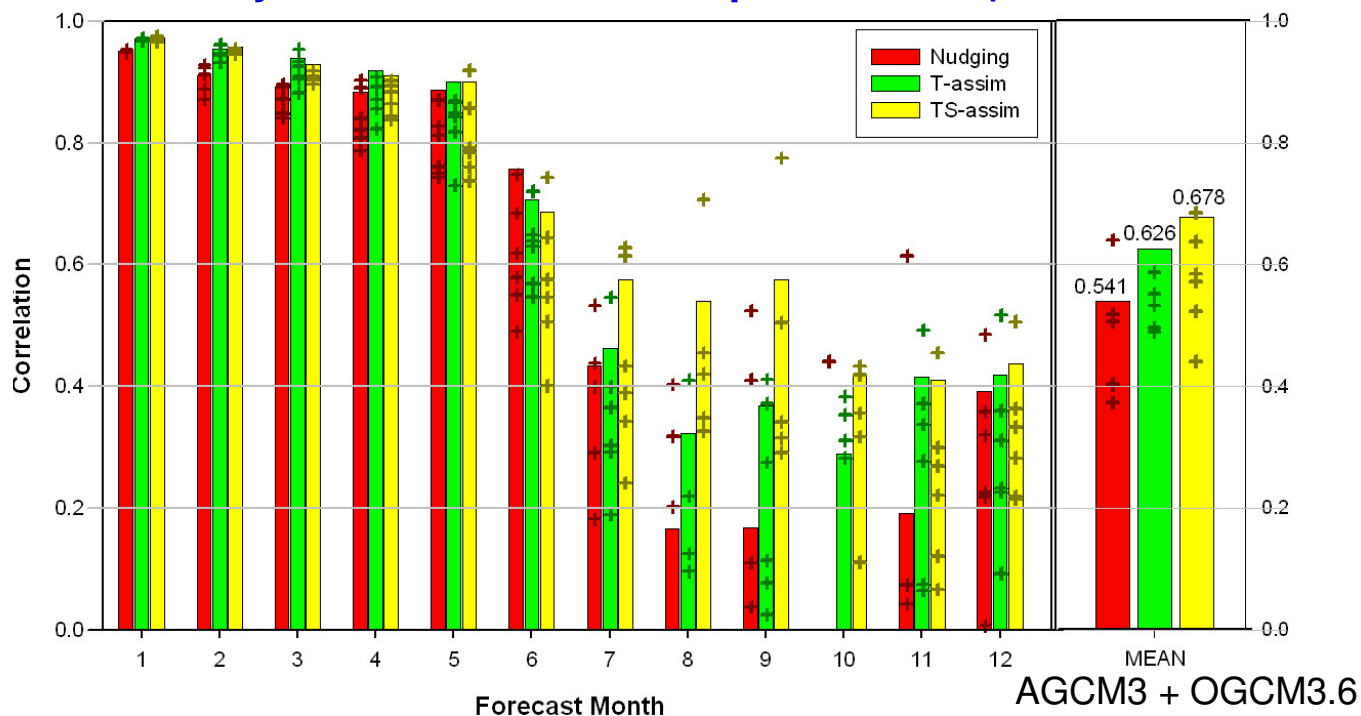
## ➤ T assimilation

- procedure of Tang et al. *JGR* 2004
- off-line variational assimilation of 3D gridded analyses

## ➤ S assimilation

- procedure of Troccoli et al. *MWR* 2002
- preservation of T-S relationship: prevents spurious convection, etc.

### Nino3.4 anomaly correlation: from 1 Sep 1980-2001 (6 ensemble members)



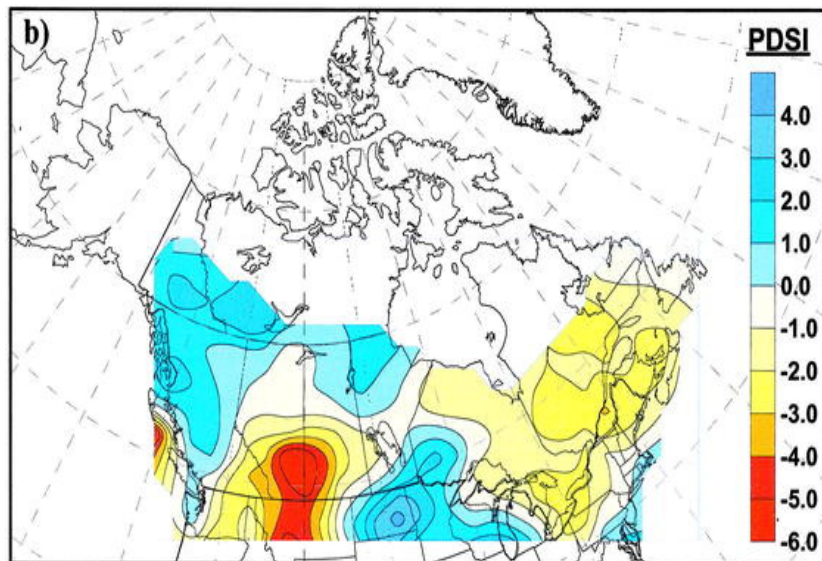


# Land surface initialization

- CCCma collaboration with U Guelph
- Strategy: drive CLASS land surface model used in CGCM off-line with *bias-corrected* reanalysis

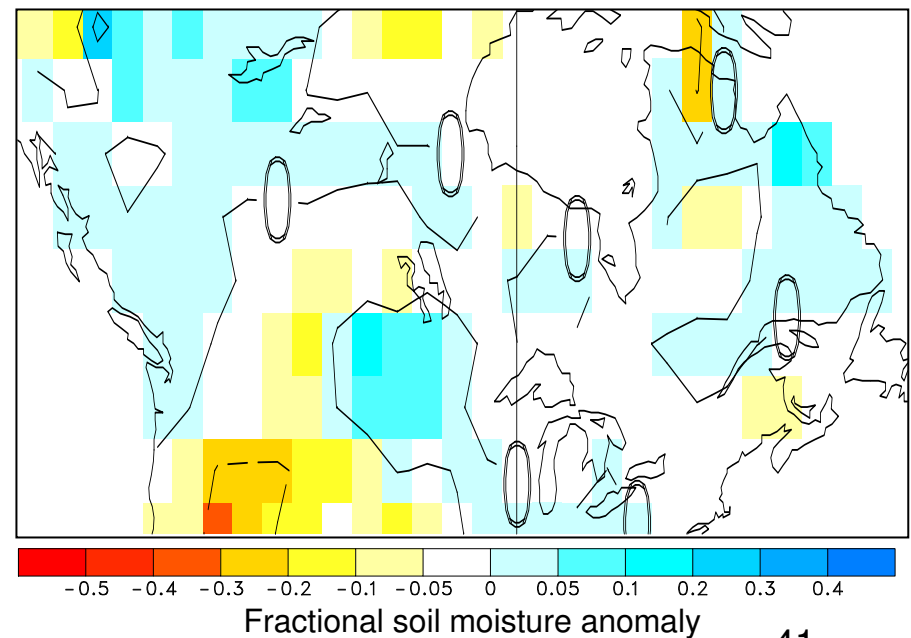
## Case study: 2001 drought

Observed Palmer Drought Severity Index: JJA 2001



(Shabbar & Skinner 2004)

Soil moisture forecast initialization

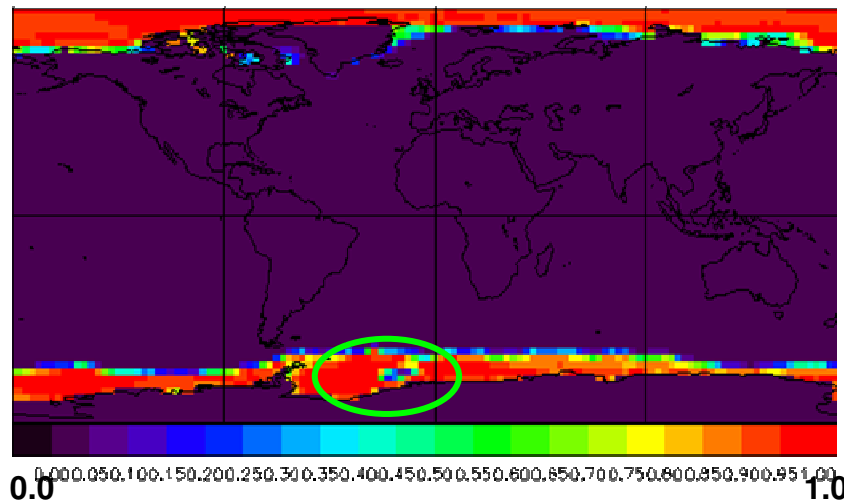


# Sea ice initialization

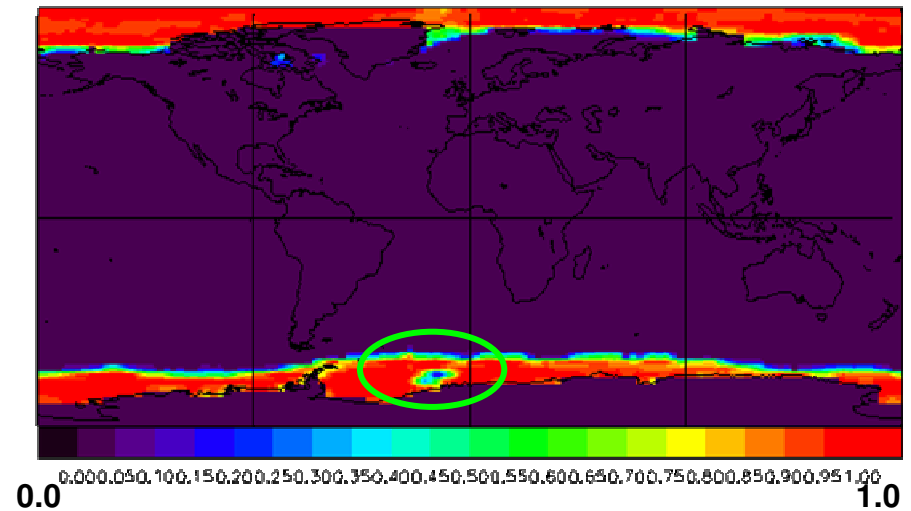
- Nudge to Hadisst observations

Sea ice concentration: August 1976

Hadisst



Forecast initial conditons

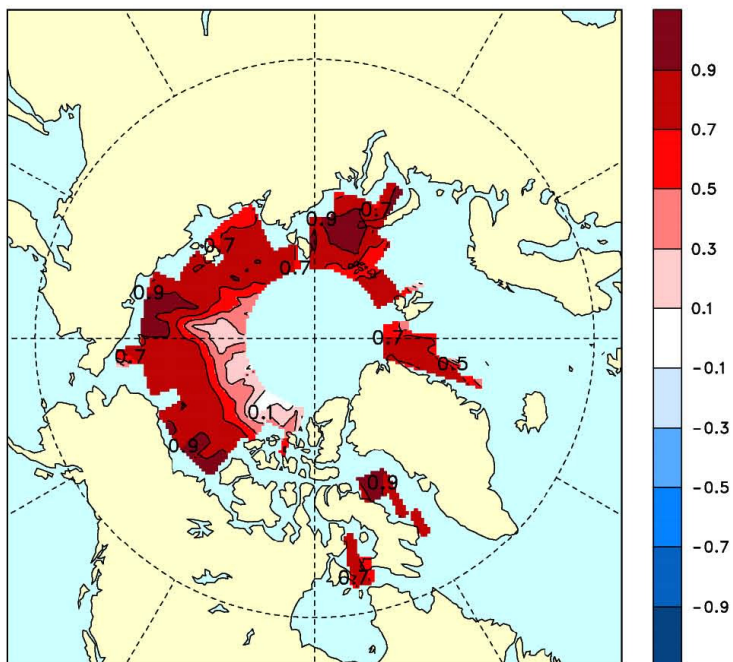


# Sea ice concentration

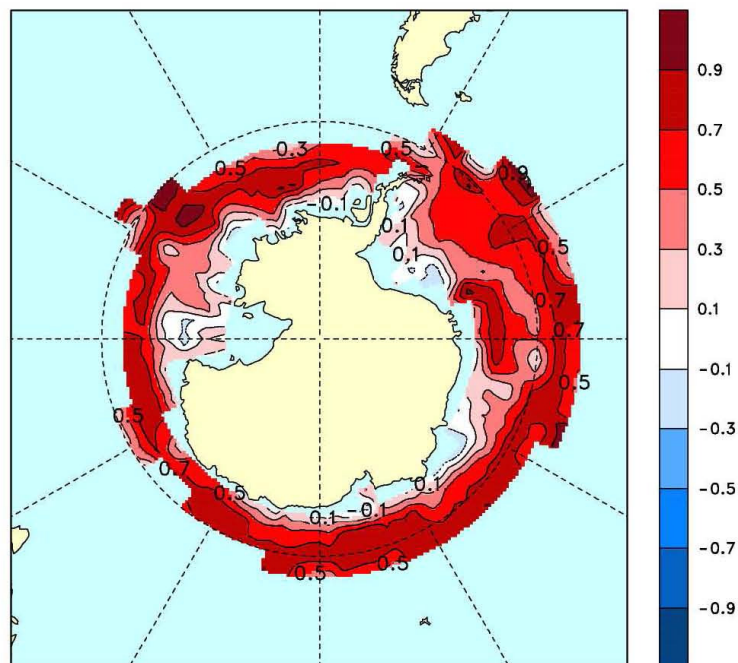
## Anomaly correlation skill score

Sep, lead=0, WS12N

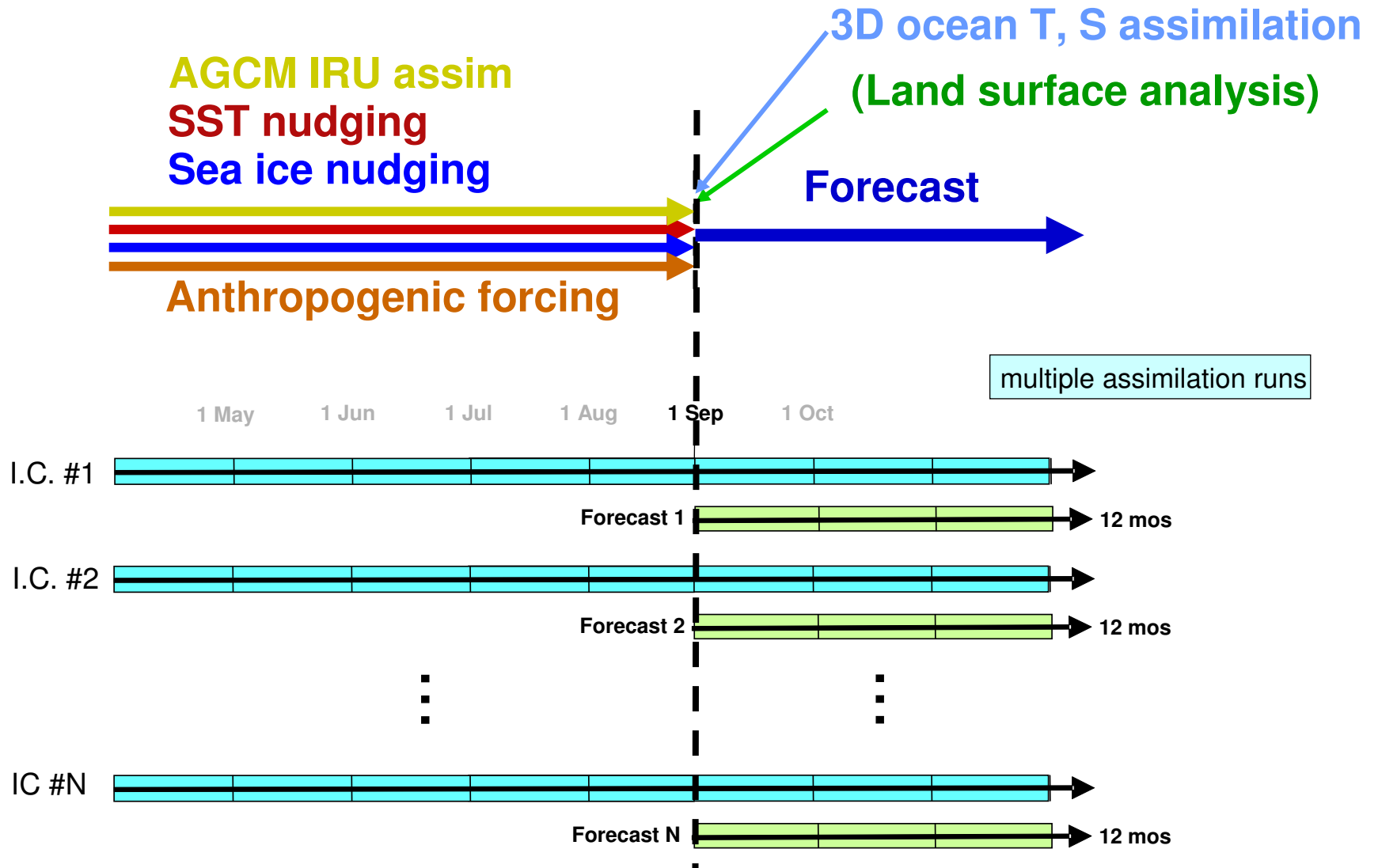
2N HADISST SICN M09 I=08 L=0 1972-2001 CORR(U)=0.6975 L=NA O=0.698



1S12N HADISST SICN M09 I=08 L=0 1972-2001 CORR(U)=0.4941 L=NA O=0.494

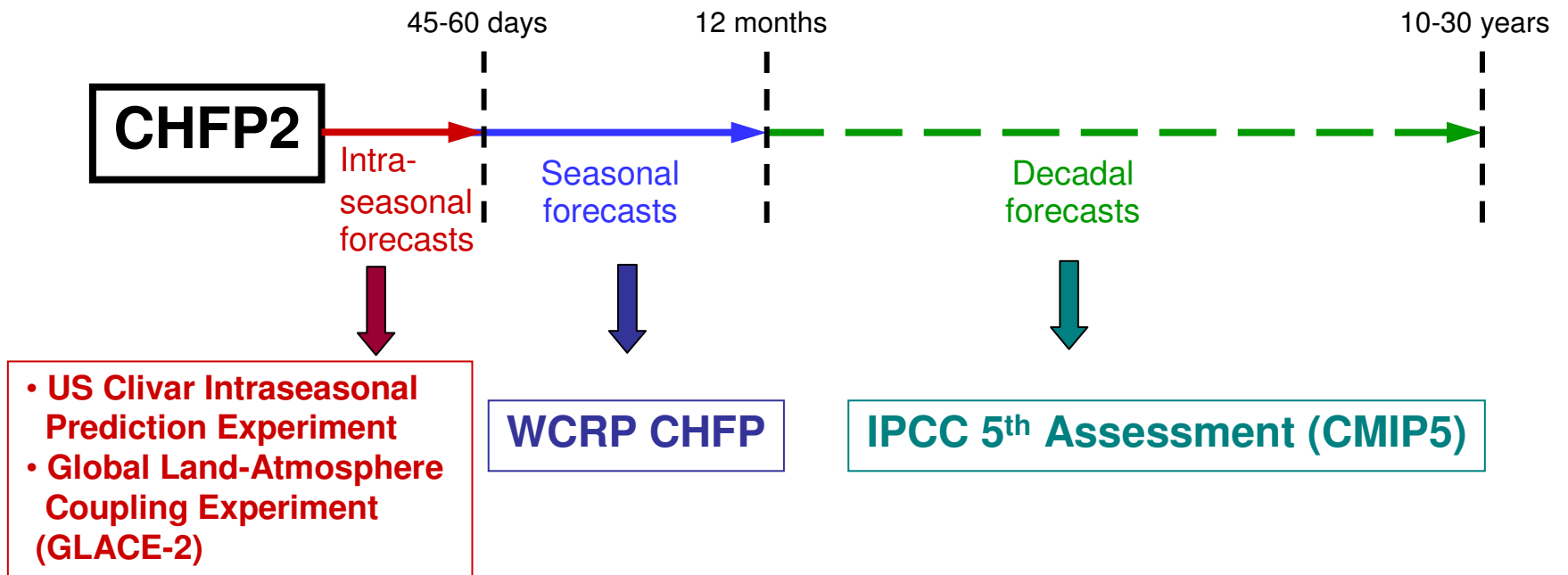


# CHFP2 initialization

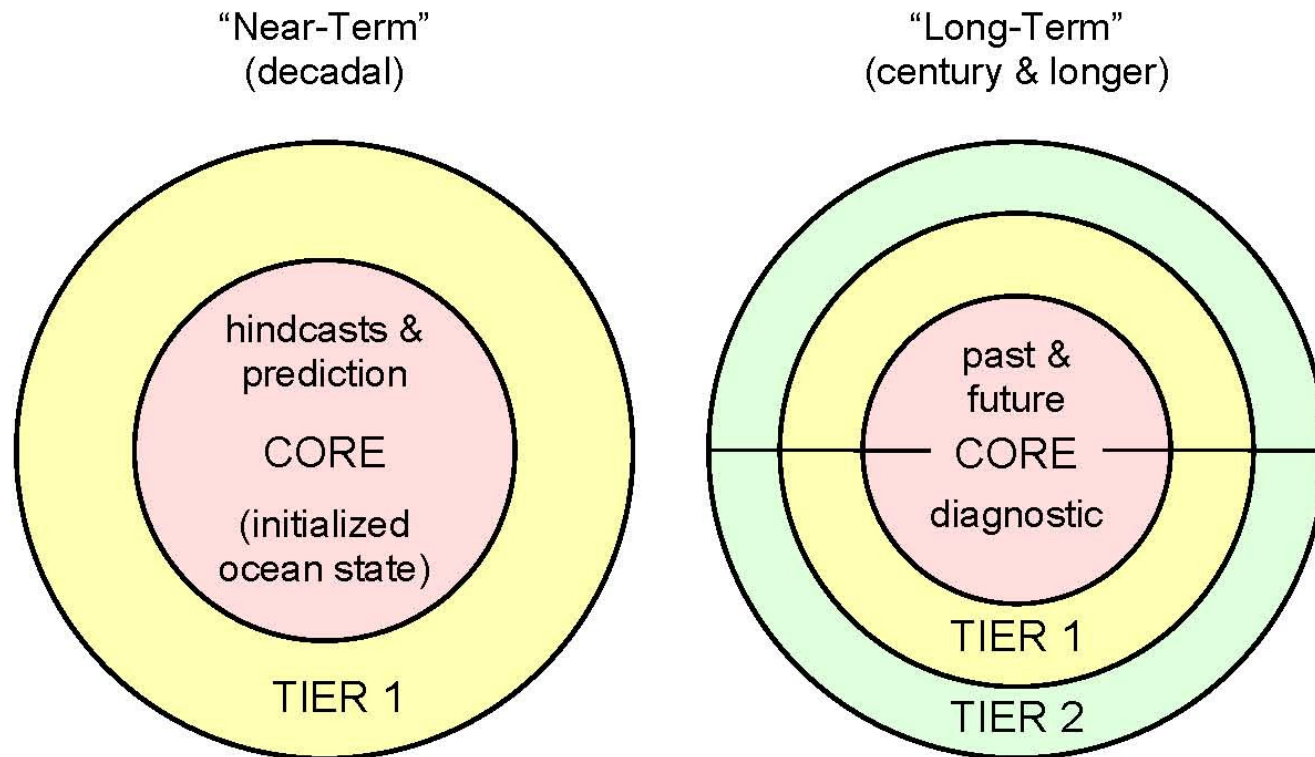


# Contributions to international activities

**“seamless” forecasts** →



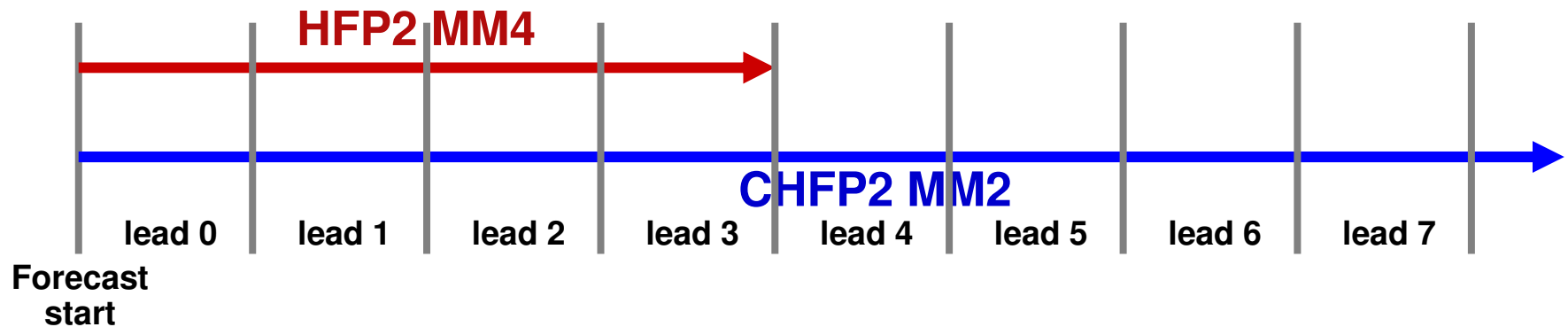
# IPCC: From projection to prediction



Schematic of the two focus areas of CMIP5

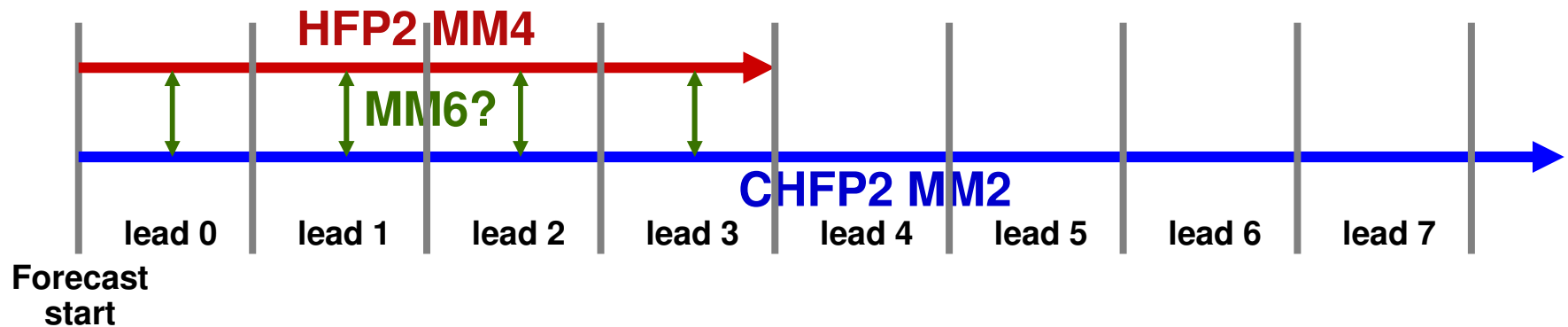
Taylor et al.: CMIP5 Experiment Design

# Future CMC Seasonal forecasts?



- GOAPP ends in 2010
- CHFP2 intended to be transitionable to operations  
→ planning, resource allocation needed
- CCCma well situated to contribute to CMIP5 *predictions*  
→ interannual-decadal predictions also could potentially become operational

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# What has GOAPP Delivered?

## Expertise in Critical Areas

- Ocean, coupled and coastal data assimilation
- Seasonal forecasting
- Land surface processes modelling and validation
- Adding value to forecasts (downscaling, statistical enhancement of forecasts)

## Ocean Hindcasts

- Reconstructions for the North Atlantic and North Pacific

## Access of Government Researchers to the University Environment

- Interaction with students and university faculty
- Helping shape the next generation of HQP
- Improving connections among departments (e.g., EC, DFO, DND)

## Funding

- Cost-sharing to support key positions
- Access to university infrastructure, computers, support staff

## Development of Operational Systems

- Pre-operational forecast system for ocean weather (CFCAS supplementary funding)
- Seasonal Forecasts Using Coupled Models (CCCma)

**Multiple agency (EC, DFO, DND) interest in coupled atmosphere-ice-ocean prediction has led to the establishment of**

***CONCEPTS: Canadian Operational Network of Coupled Environmental Prediction Systems***

**To coordinate the national development and implementation of ocean models, DFO has established**

***COMDA: Centre for Ocean Model Development and Application***

***Theme 1 of GOAPP contributes to,  
and benefits from, CONCEPTS.***

# After CHFP2

## ➤ **Transition to EC operations?**

- will need expanded set of retrospective forecasts
- retention of HQP crucial

## ➤ **Ongoing R & D**

- Theme I & II research providing innovative bases for further forecast system improvements
- Bias removal through spectral nudging (Theme I)
- Data assimilation (Tang UNBC)
- Nonlinear forecast post-processing (Hsieh UBC)

# Issues and Opportunities

- GOAPP finishes December 2010
- Delivering products hinges on retention of GOAPP's newly trained HQP
- Need to better coordinate research in the government and academic sectors in order to maximize use of future funding
  - ? Resurrect and expand the subvention programs for funding targeted research in universities
  - ? Enable academia to play more active role in CONCEPTS and seasonal to decadal prediction