

Sources of predictability beyond the deterministic limit

Franco Molteni, Sarah Keeley

European Centre for Medium-Range Weather Forecasts

Outline

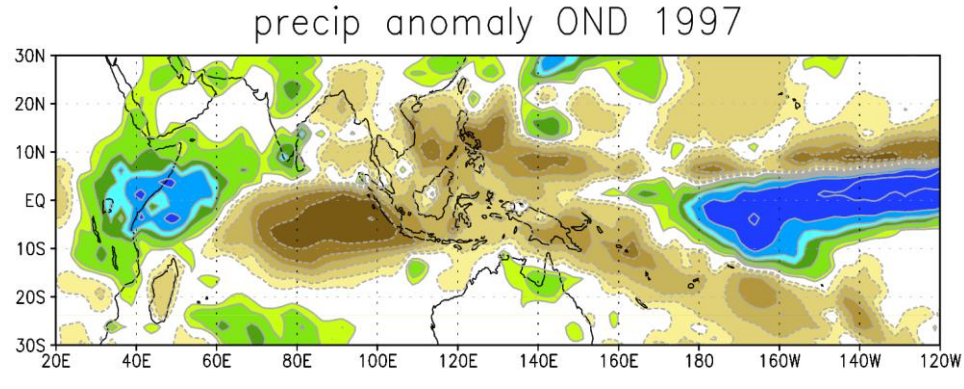
Persistent anomalies in the tropics and extra-tropics:
examples from the last two decades

Beyond deterministic predictability in non-linear, chaotic
systems: the role of variability in surface conditions and
energy/water fluxes

Coupled ocean-atmosphere variability - predictability on the
weekly/monthly time scale arising from sub-seasonal tropical
variability and teleconnections

A look at sea ice and the impact on predictions

Oct-Dec 1997: floods in East Africa



Rift Valley Fever outbreak

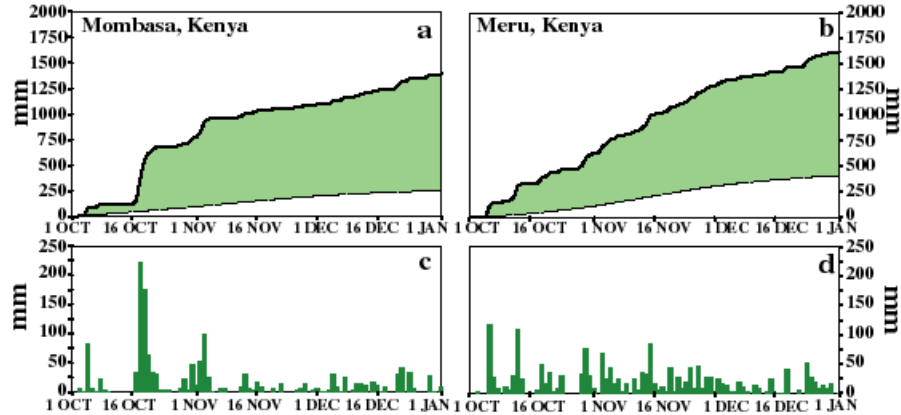
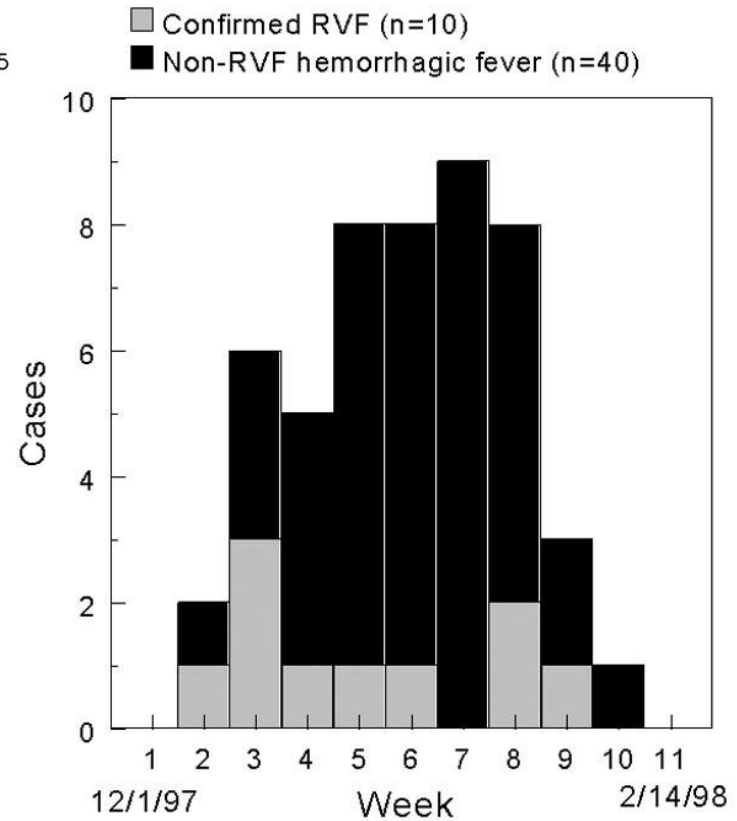
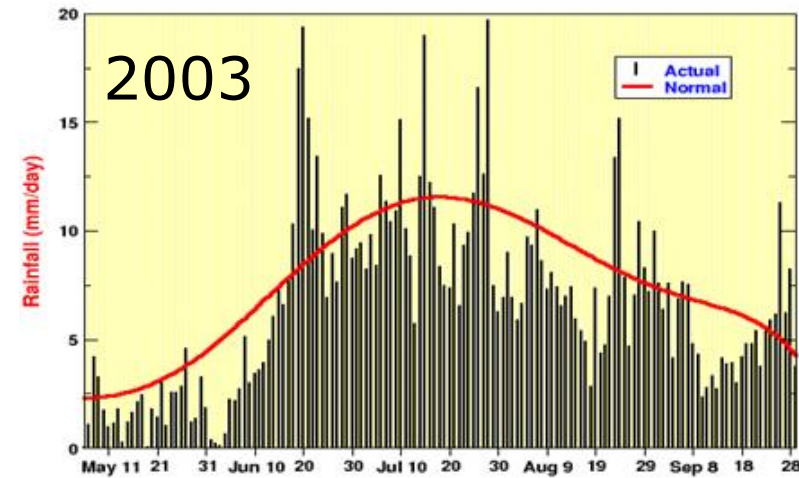
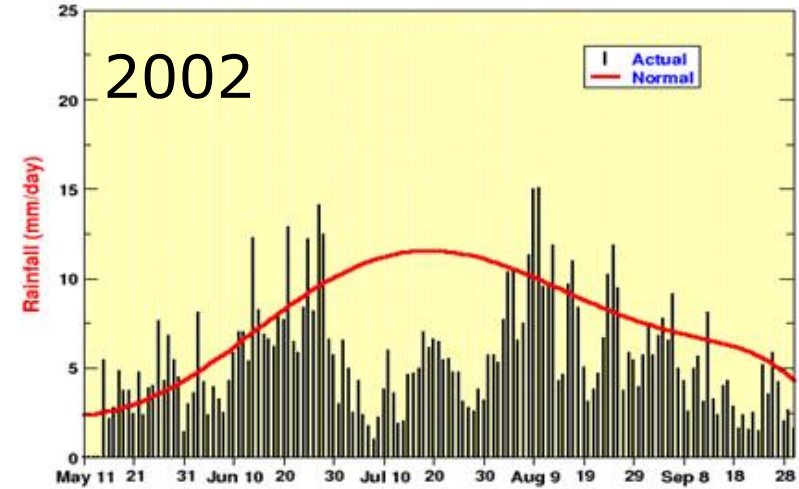


FIG. 45. (a, b) Accumulated observed precipitation (solid curve) and accumulated climatological precipitation (1961–90 base period) (dashed curve) beginning 1 October 1997 and ending 1 January 1998 at (a) Mombasa, Kenya and (b) Meru, Kenya. (c, d) Daily precipitation totals during October 1997–1 January 1998 at (c) Mombasa, Kenya and (d) Meru, Kenya. Green shading in (a)–(b) indicates the difference between the observed and normal accumulated rainfall.

July 2002: drought in India



All-India Rainfall time series
May - October

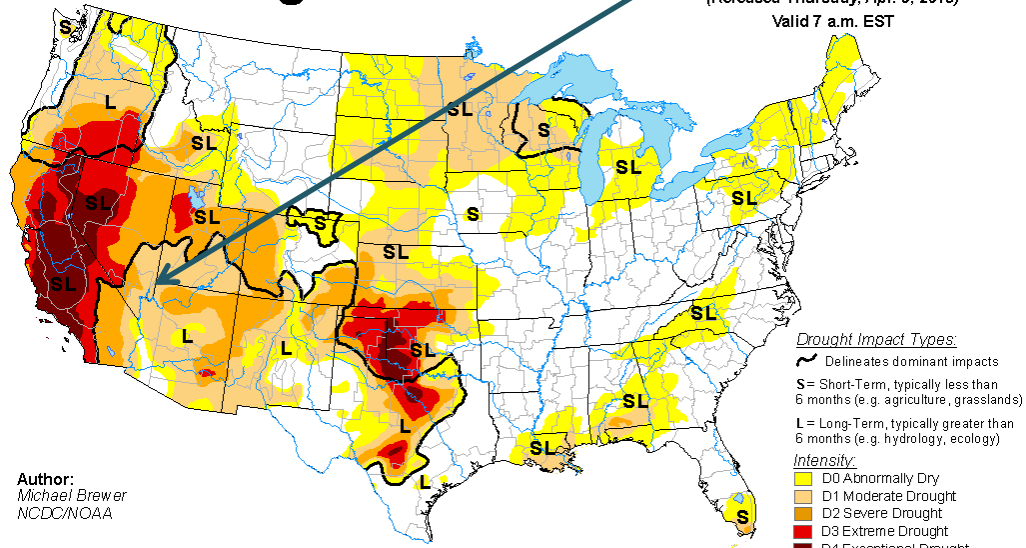
Drought in South-western USA

Lake Mead, Colorado River

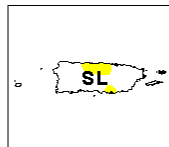
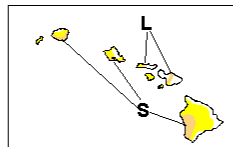
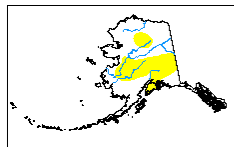


U.S. Drought Monitor

April 7, 2015
(Released Thursday, Apr. 9, 2015)
Valid 7 a.m. EST



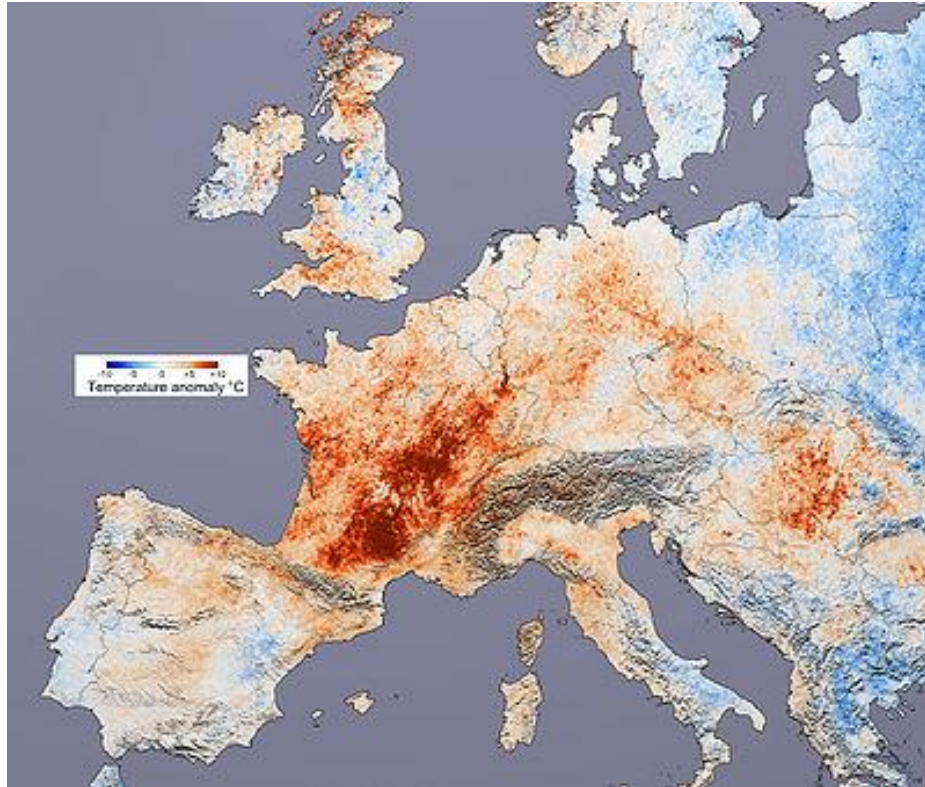
Author:
Michael Brewer
NCCDC/NOAA



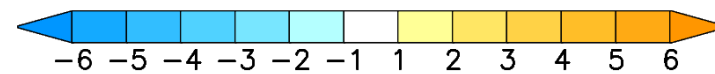
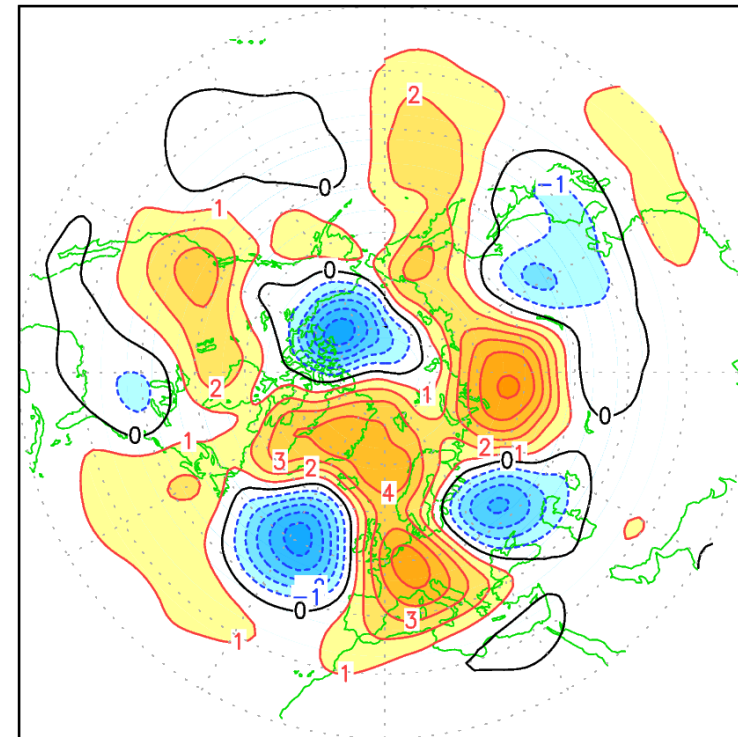
<http://droughtmonitor.unl.edu/>

Lake Mead (Arizona / Nevada) 15-year drought

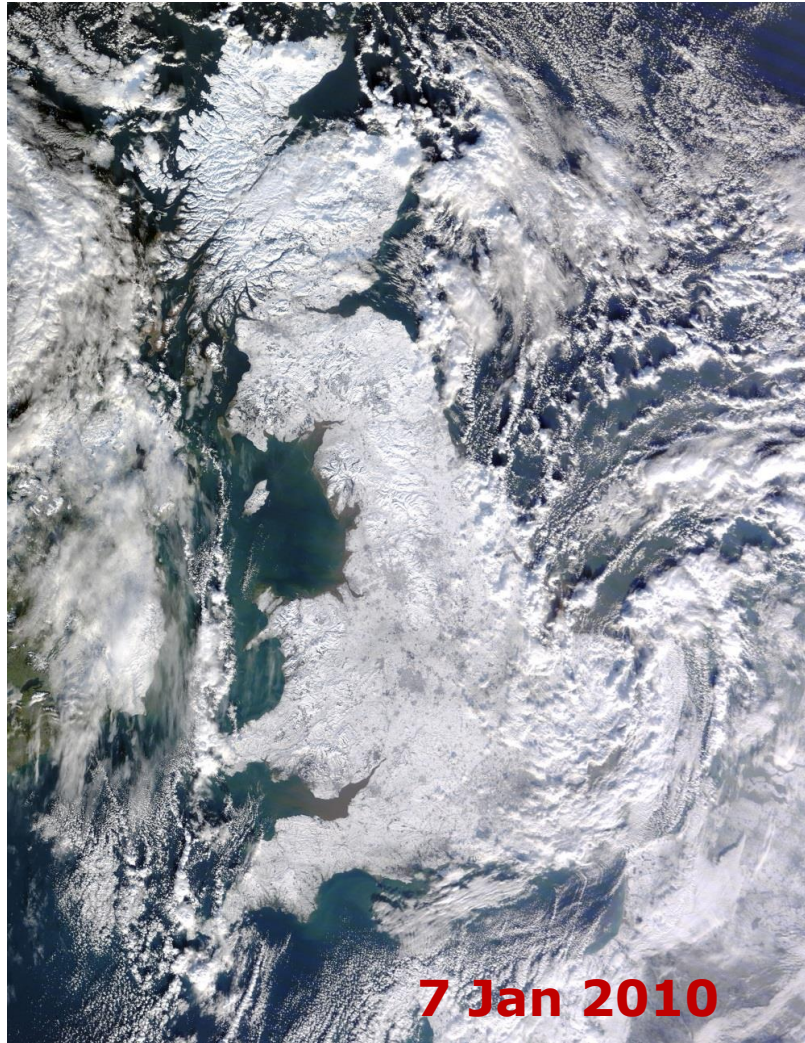
Summer 2003: European heat-wave



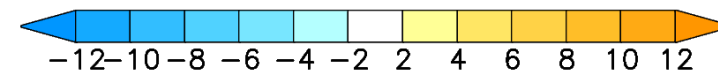
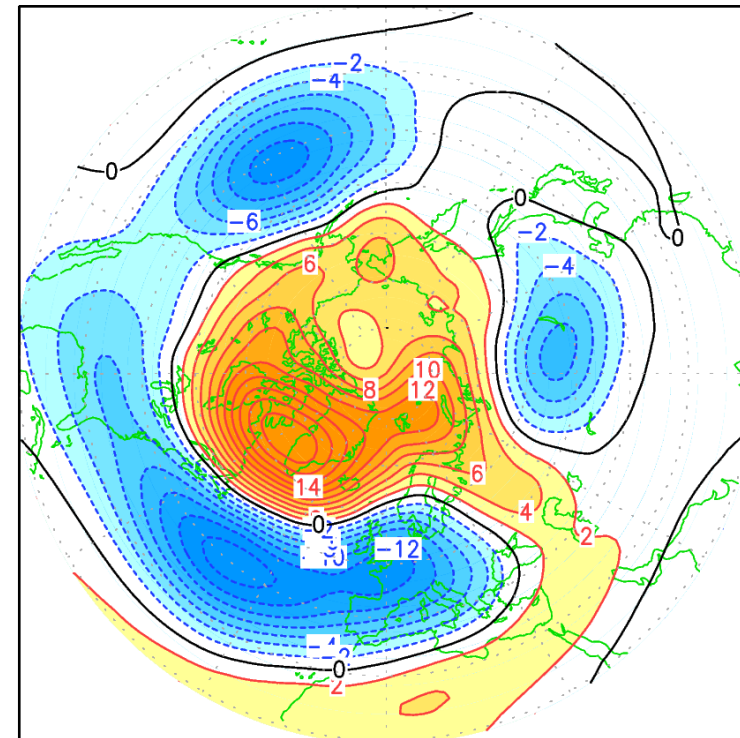
Z 500 anomaly JJA 2003



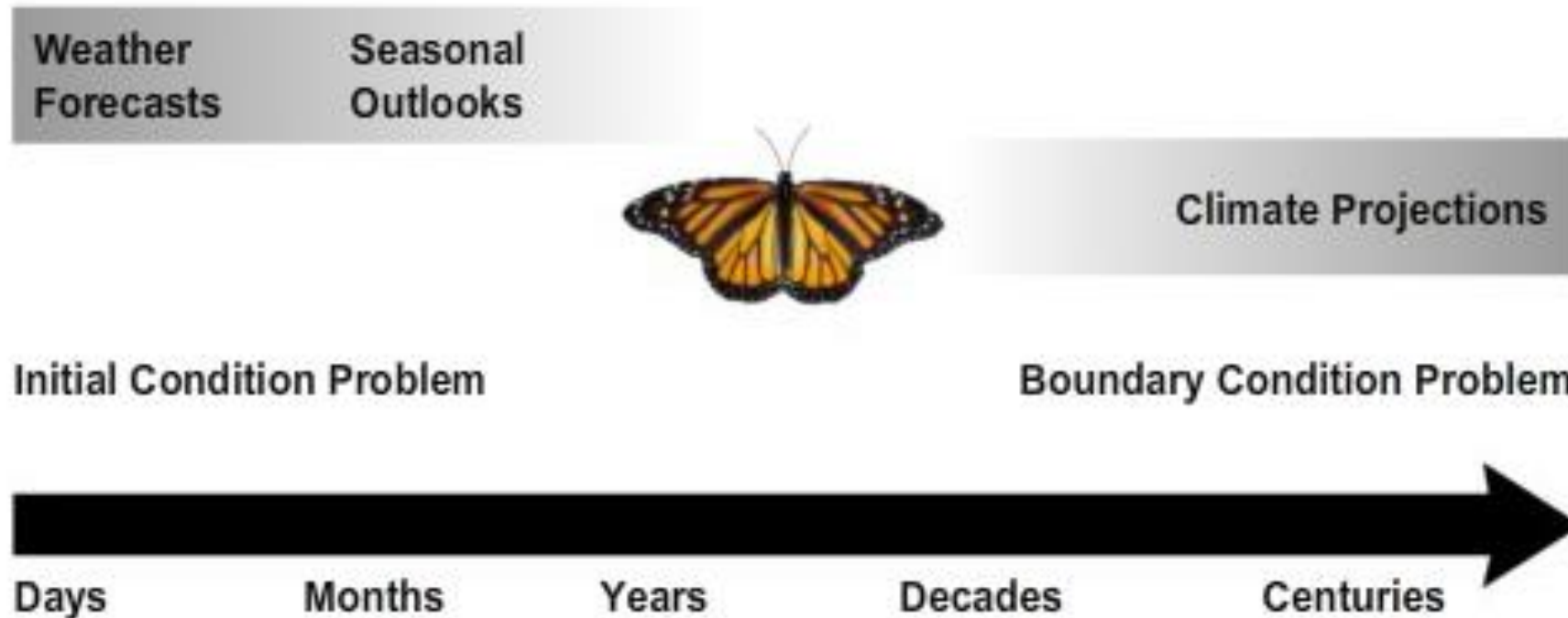
Winter 2009-2010: cold anomaly over N. Europe



Z 500 anomaly DJF 2009/10



Short-term climate forecasts are a mixed initial-boundary condition problem in a chaotic system.



How can we forecast on long timescales?

Ocean

Sea ice

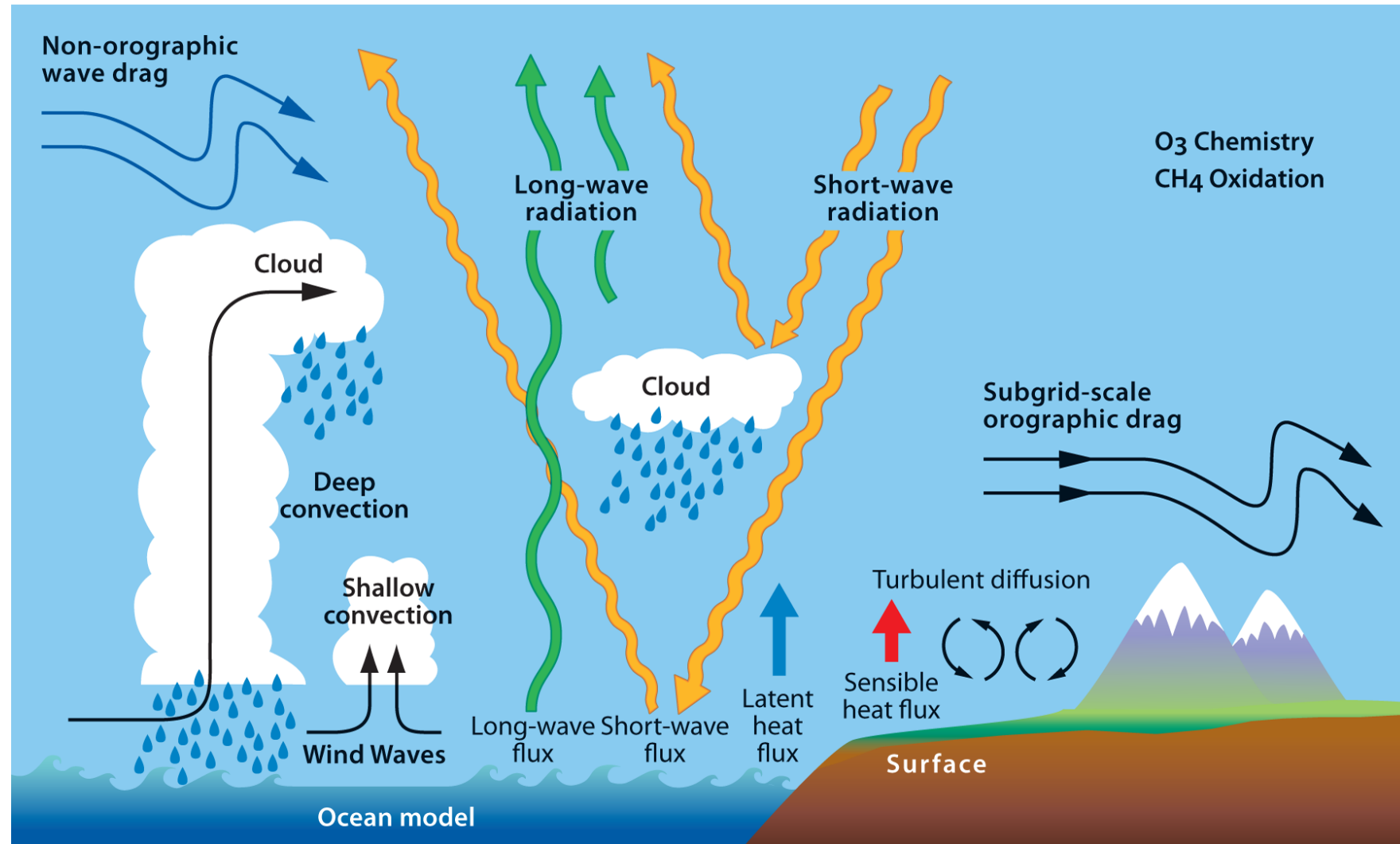
Land Surface

- Soil moisture
- Vegetation
- Snow

Stratosphere

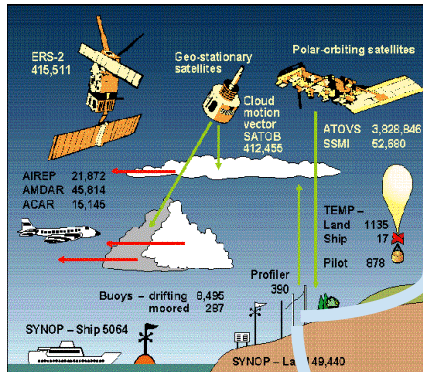
Atmospheric composition

Incoming solar radiation



Forecast models extended range predictions (All ensemble forecasts at ECMWF)

Observations



Data Assimilation

current state of the atmosphere

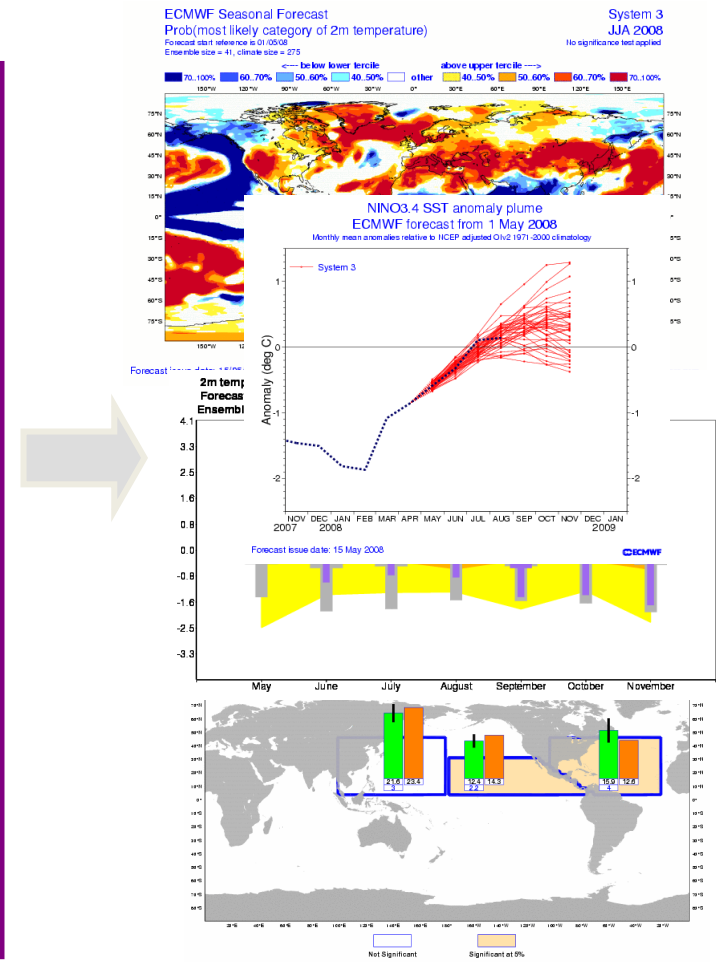
current state of the ocean

Coupled model

atmospheric model

ocean model

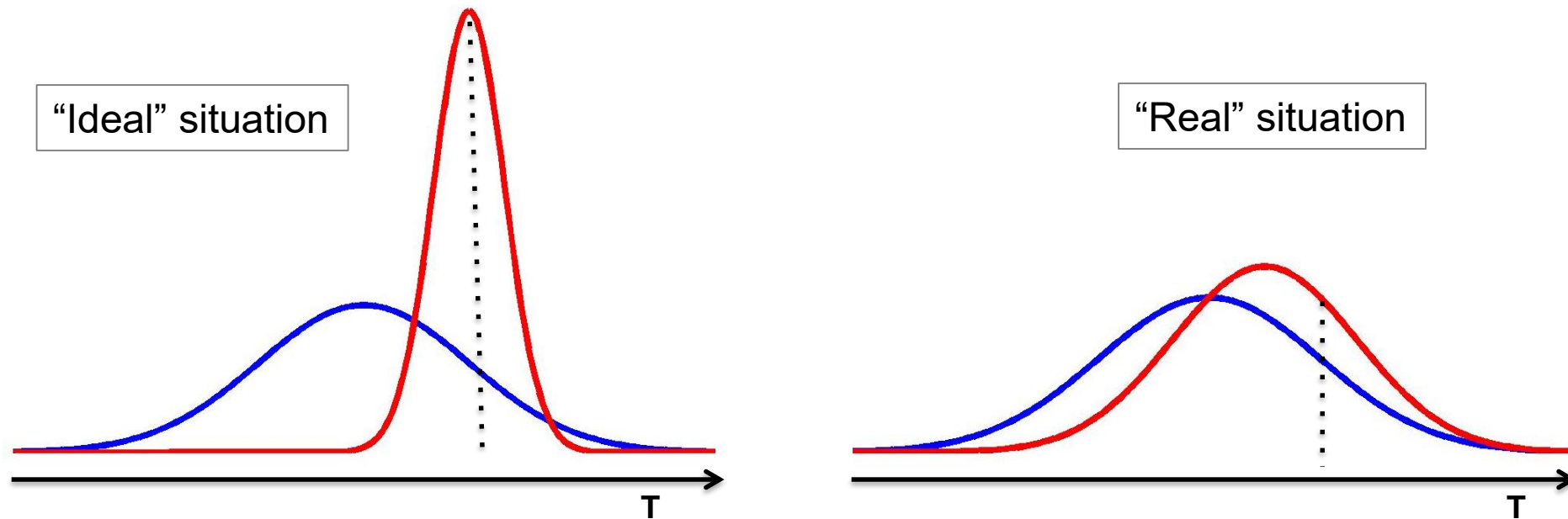
Forecast Products

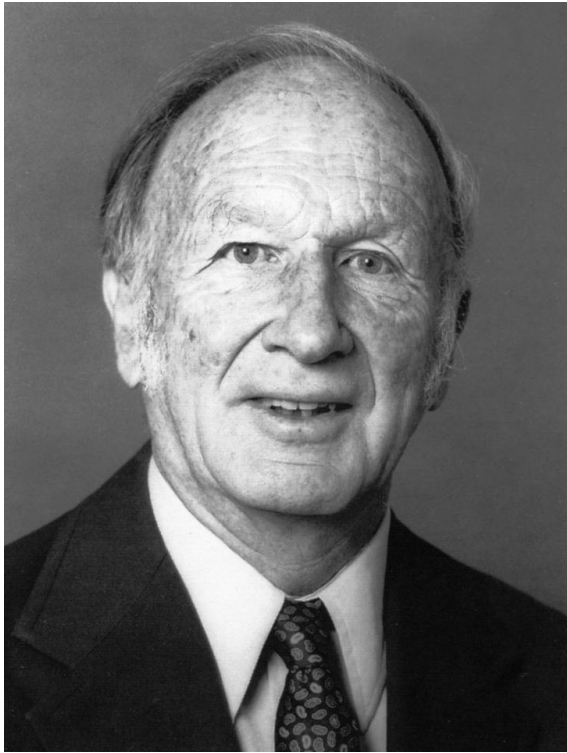


Forecasting probability distributions

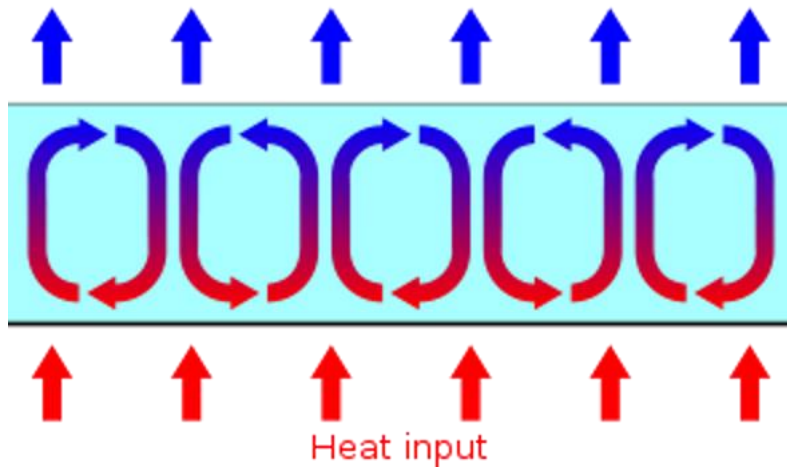
Seasonal forecasts aim to predict an anomaly from the default climatological probability.

Probability density distributions of a hypothetical
climatology and forecast given an observation.

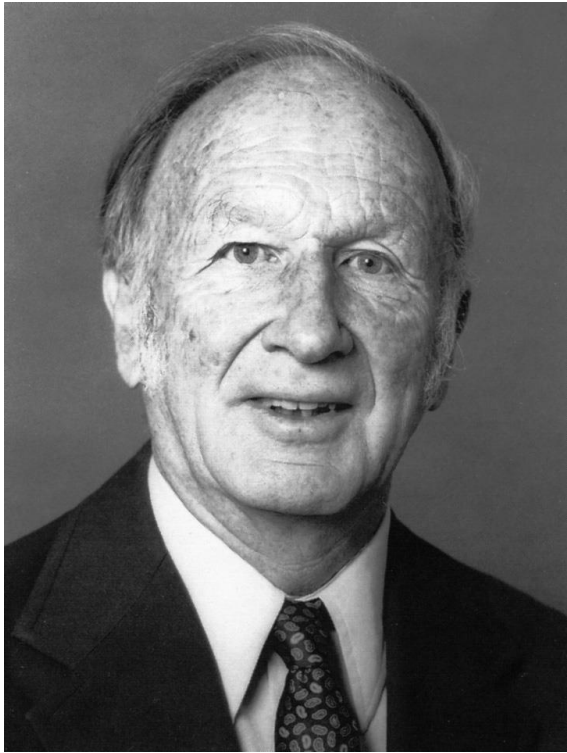




$$\begin{aligned}\dot{X} &= -\sigma X + \sigma Y \\ \dot{Y} &= -XZ + rX - Y \\ \dot{Z} &= XY - bZ\end{aligned}$$

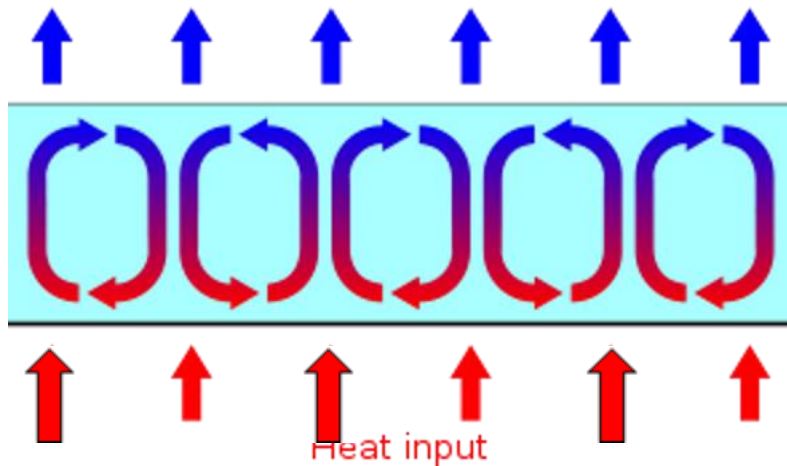


Lorenz E., 1963: Deterministic non-periodic flow



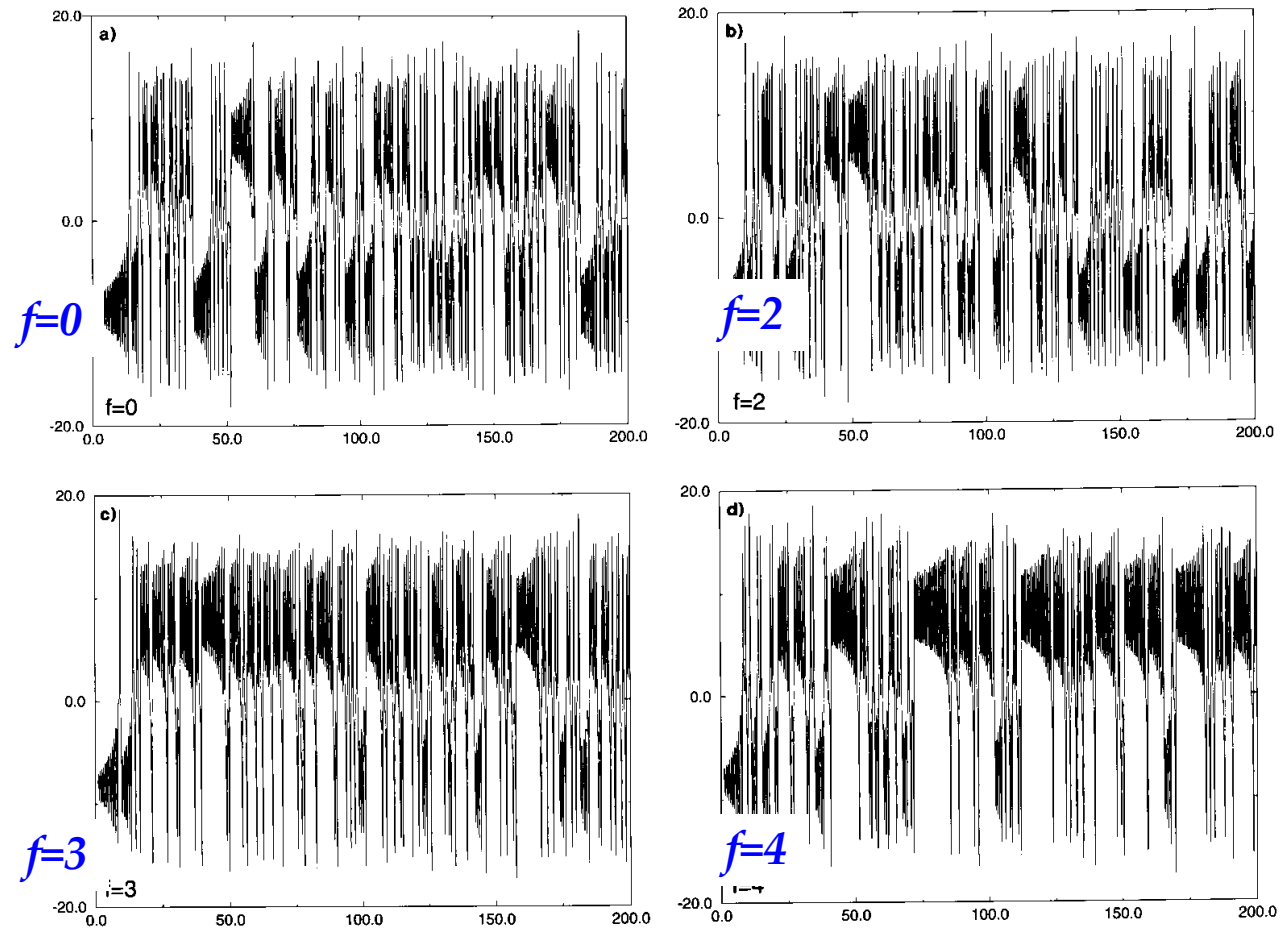
$$\begin{aligned}\dot{X} &= -\sigma X + \sigma Y \\ \dot{Y} &= -XZ + rX - Y + f \\ \dot{Z} &= XY - bZ\end{aligned}$$

What is the impact of f on the attractor?



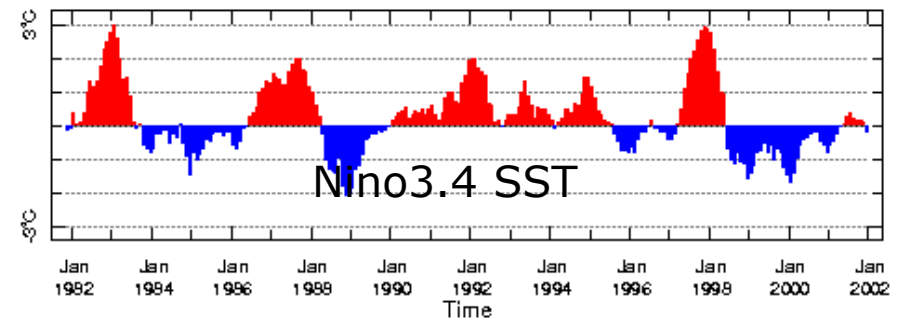
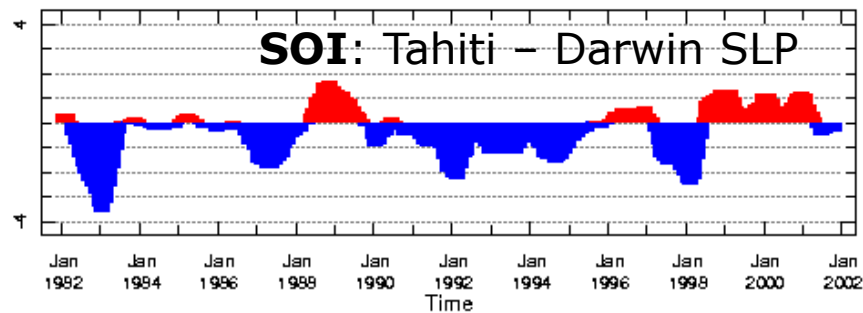
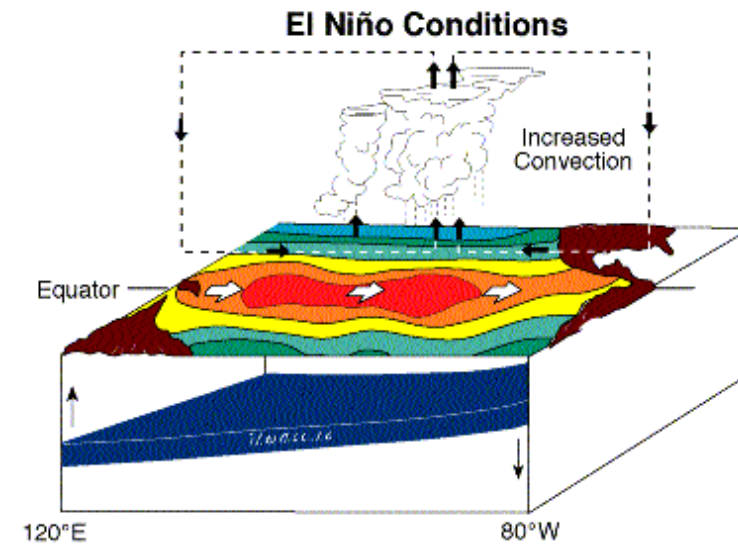
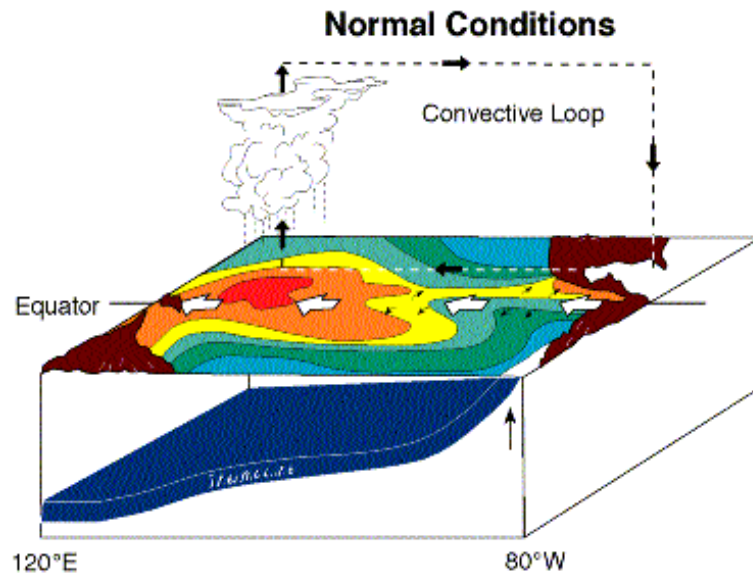
Lorenz E., 1963: Deterministic non-periodic flow

Add external steady forcing f to the Lorenz (1963) equations



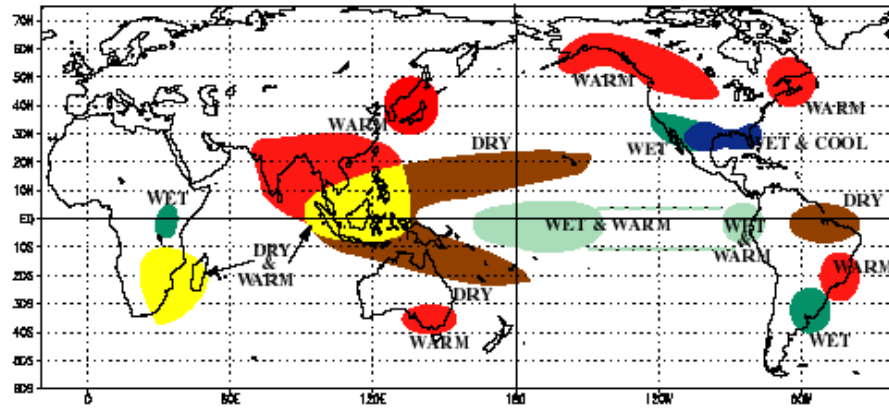
The influence of f on the state vector probability function is itself predictable.

El Niño and the Southern Oscillation

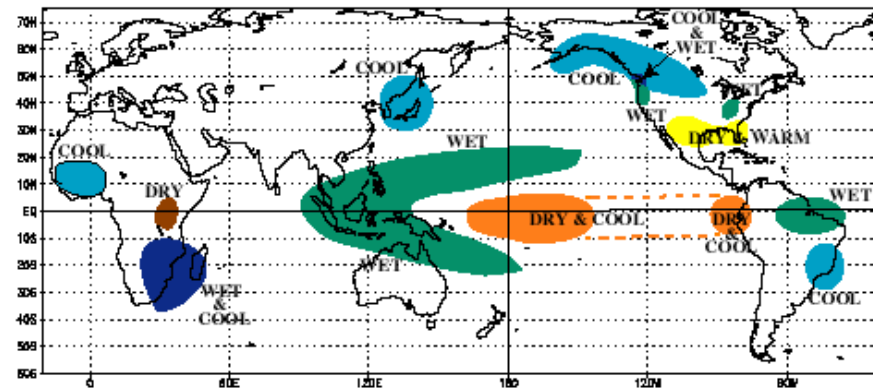


ENSO impacts: rainfall and temperature

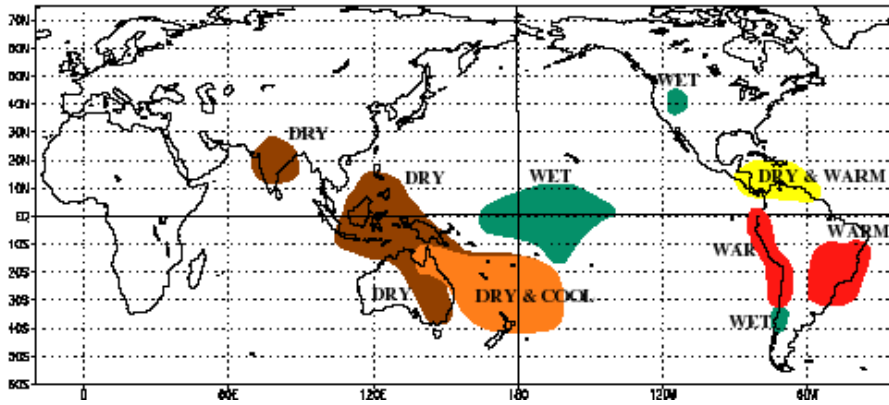
WARM EPISODE RELATIONSHIPS DECEMBER - FEBRUARY



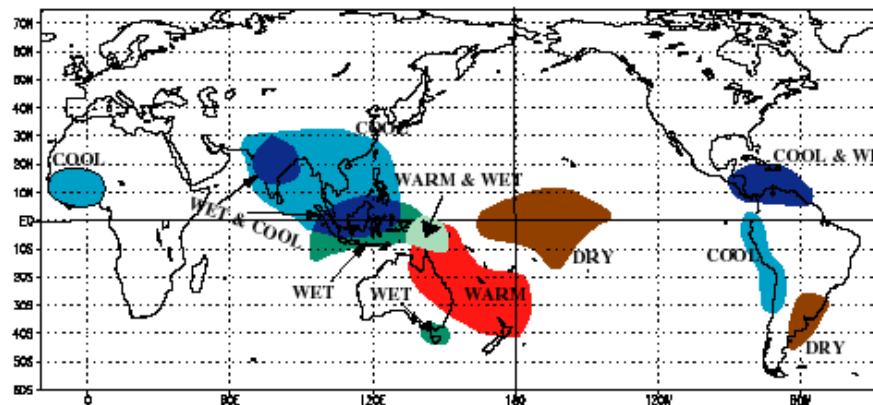
COLD EPISODE RELATIONSHIPS DECEMBER - FEBRUARY



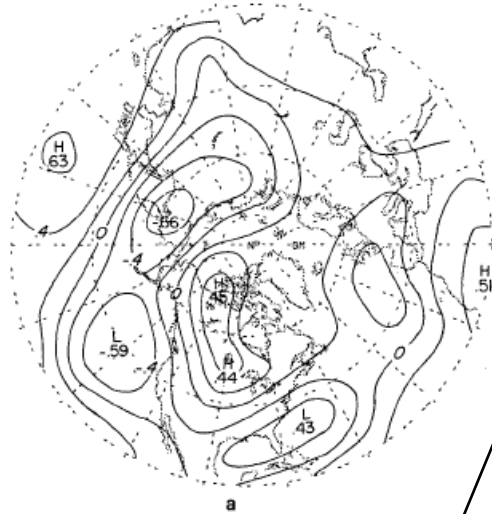
WARM EPISODE RELATIONSHIPS JUNE - AUGUST



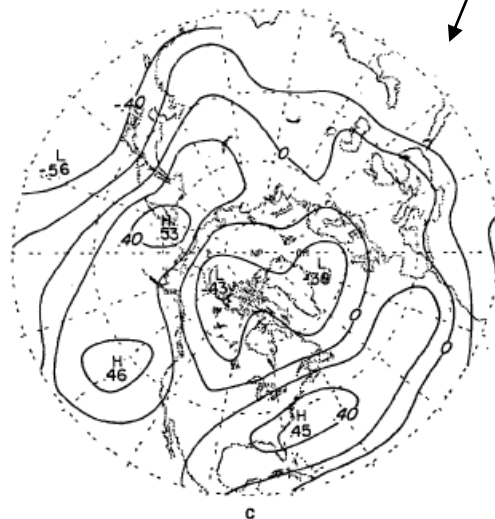
COLD EPISODE RELATIONSHIPS JUNE - AUGUST



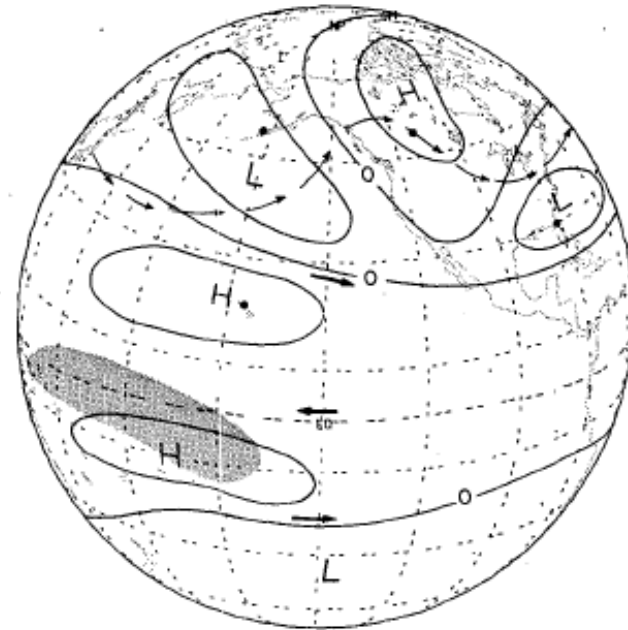
Teleconnections with ENSO



Correlation of 700hPa height with
a) PC1 of Eq. Pacific SST
c) SOI index



Schematic diagram of tropical-extratropical teleconnections during El Niño



Horel and
Wallace 1981

The Pacific /North American (PNA) pattern

500-hPa height
composites
from
Wallace and
Gutzler 1981

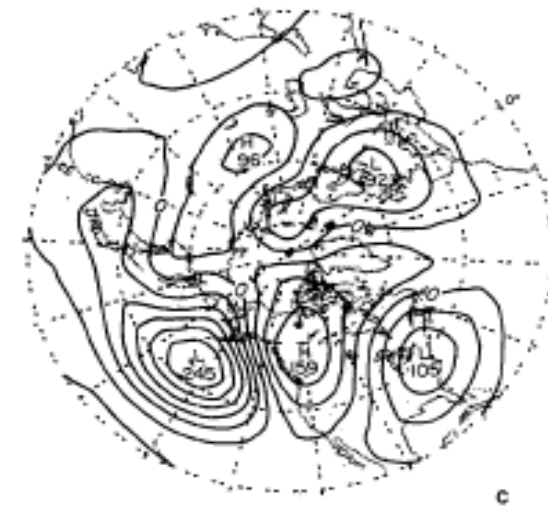
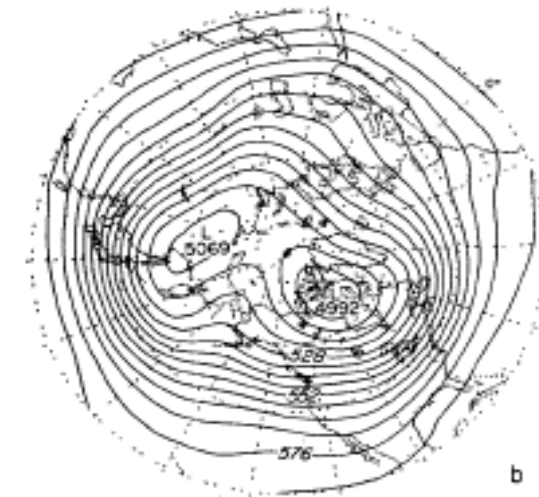
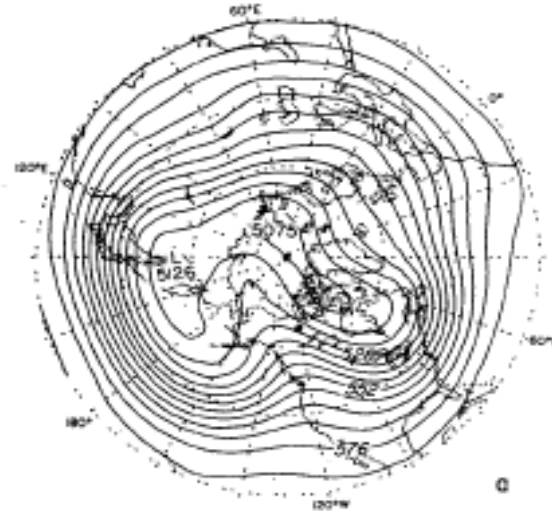


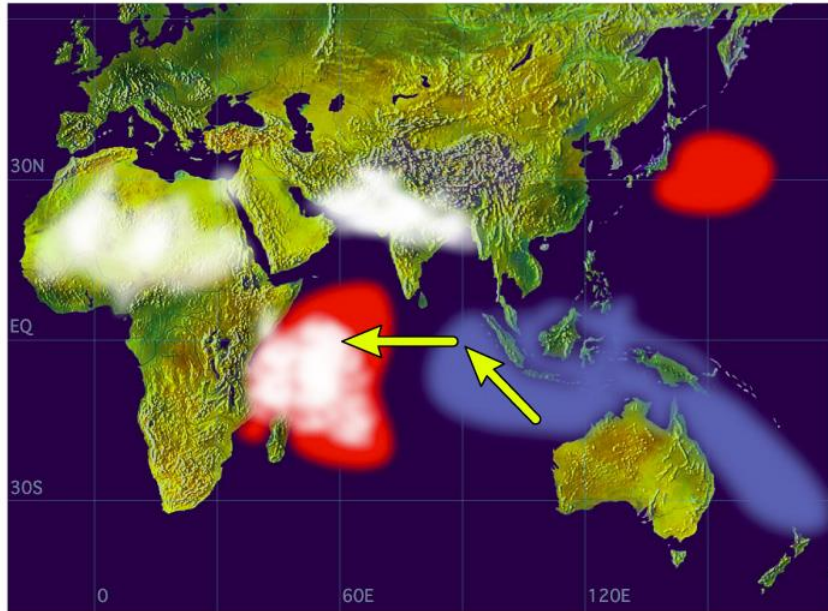
FIG. 17. As in Fig. 13 except for the Pacific/
North American pattern.

The Indian Ocean Dipole (or I.O. Zonal Mode)

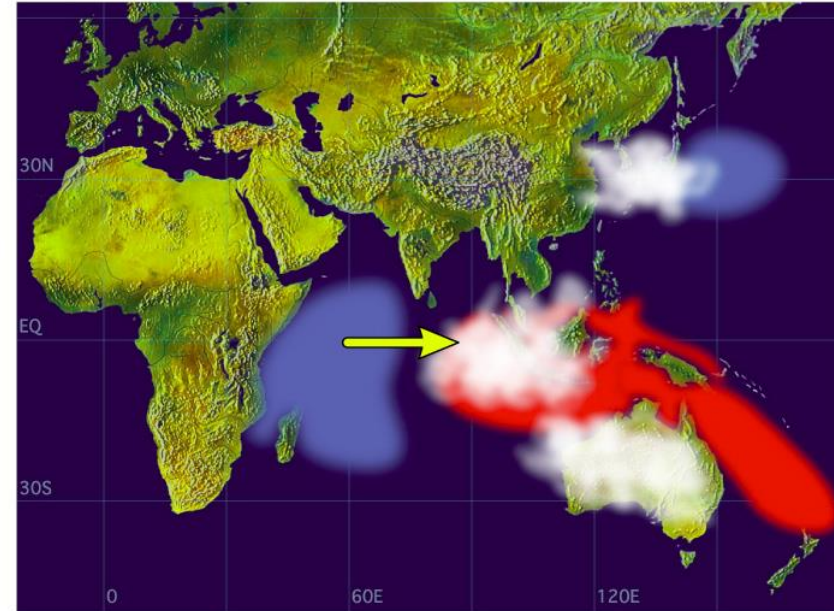
Saji et al. (1999)

Webster et al. (1999)

Positive Dipole Mode

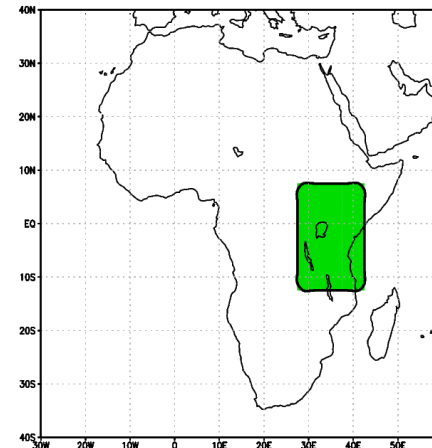
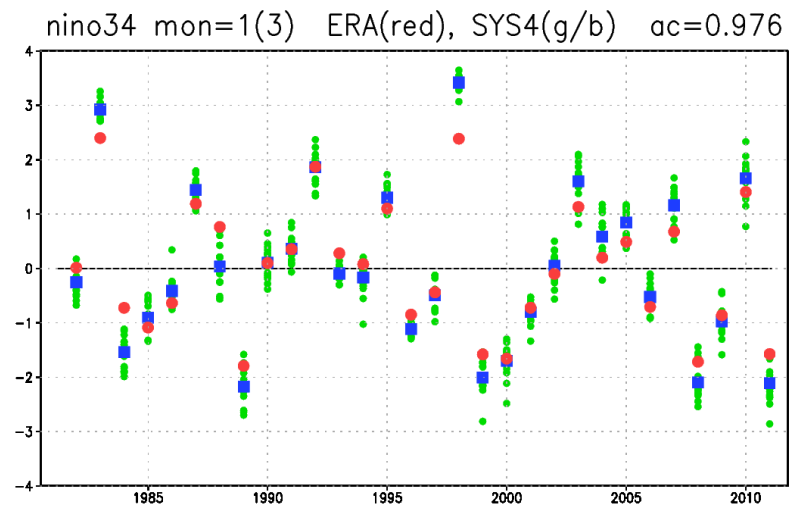


Negative Dipole Mode

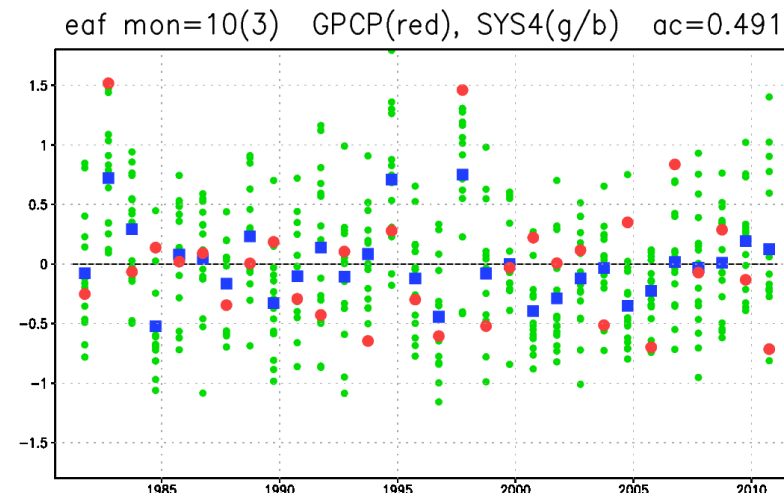
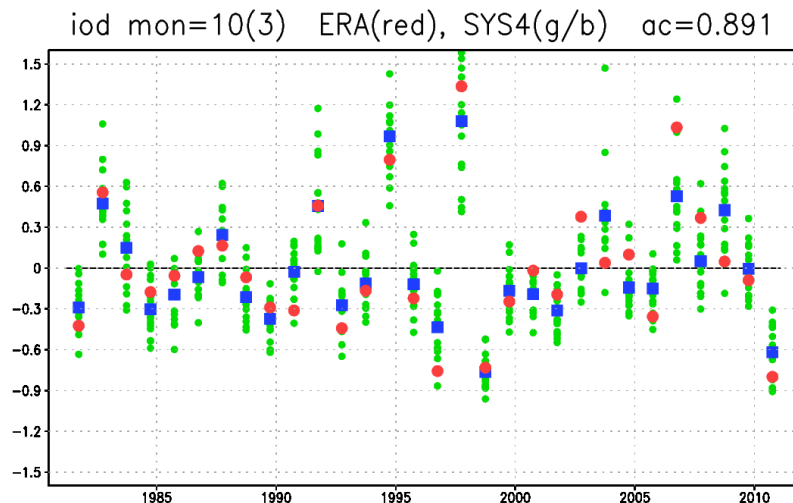


Prediction of tropical SST and rainfall anomalies in Sys4

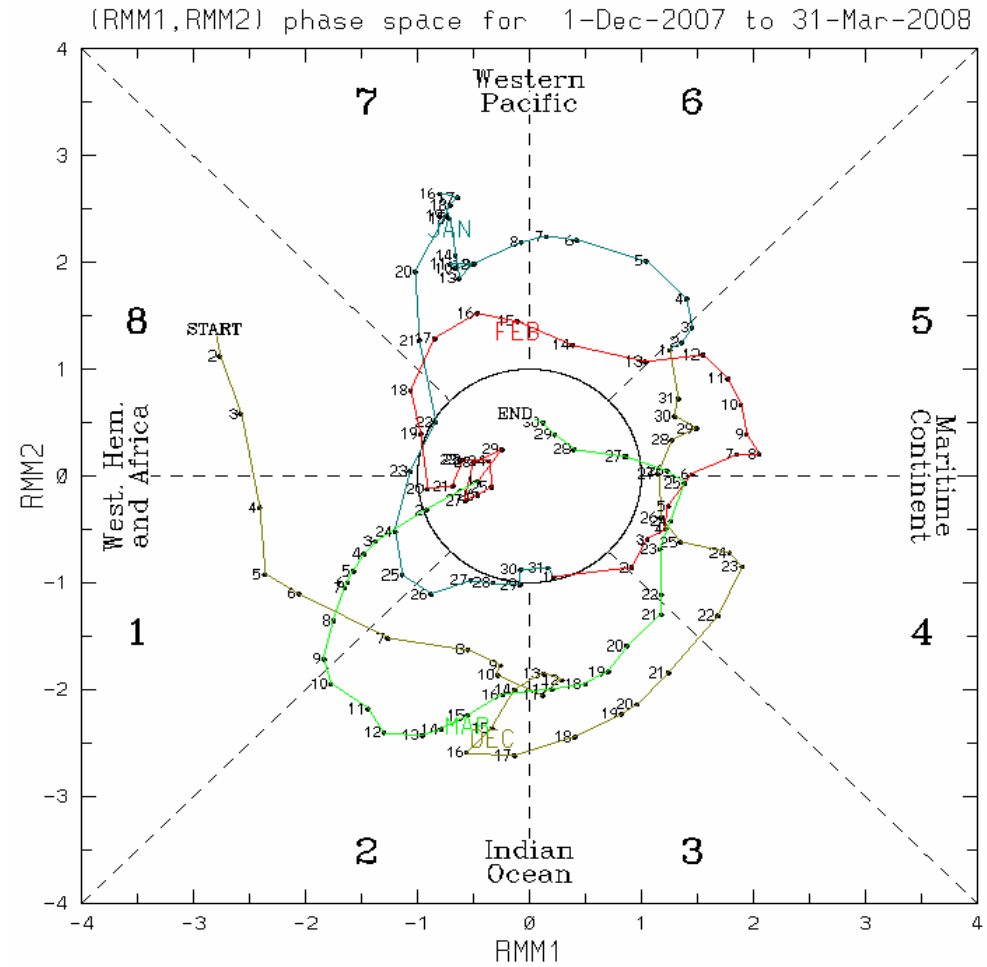
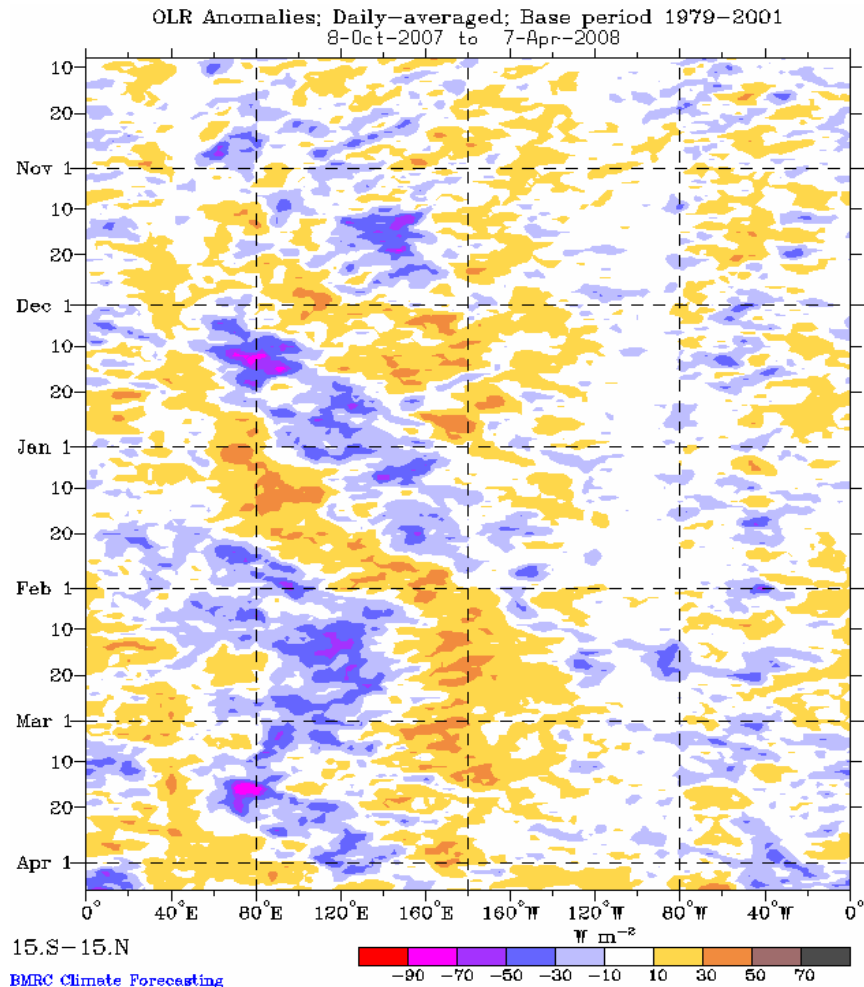
Nino3.4
DJF



IOD
SON



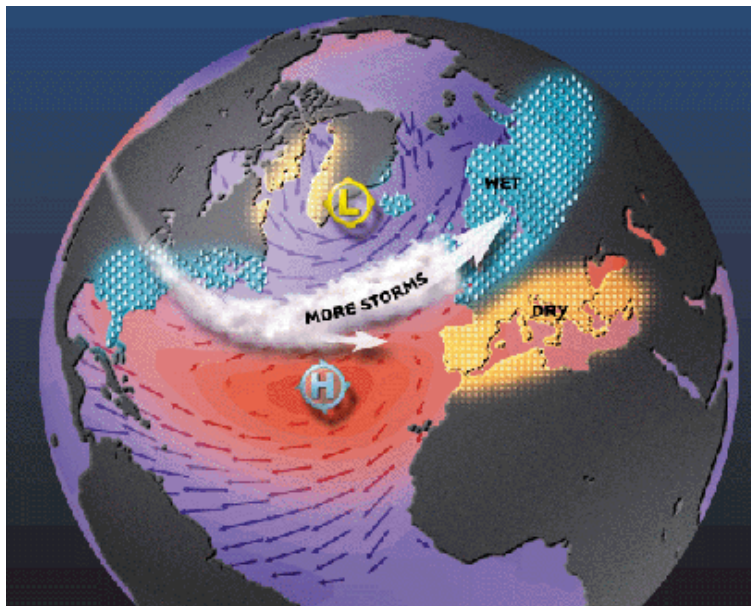
Sub-seasonal variability: the Madden-Julian Oscillation



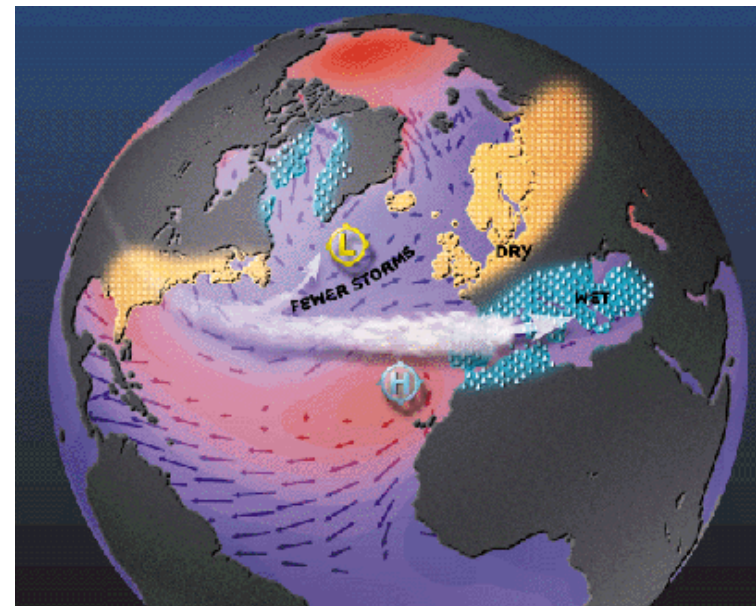
The North Atlantic Oscillation

Walker and Bliss (1932)

Van Loon and Rogers (1978)



Positive NAO phase

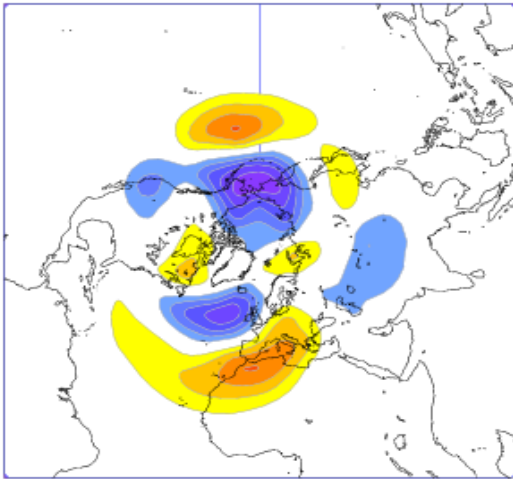


Negative NAO phase

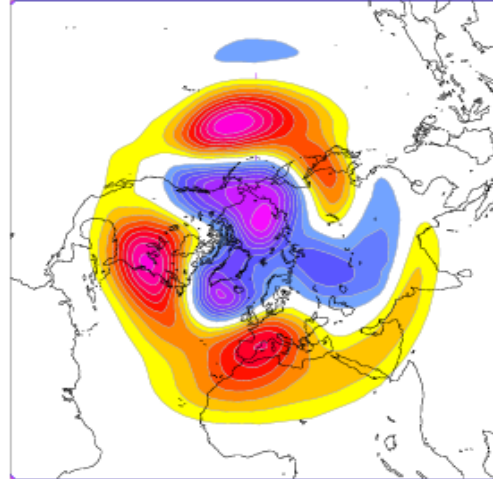
MJO teleconnections in October-March

500 hPa height, MJO phase 3 + 10 days

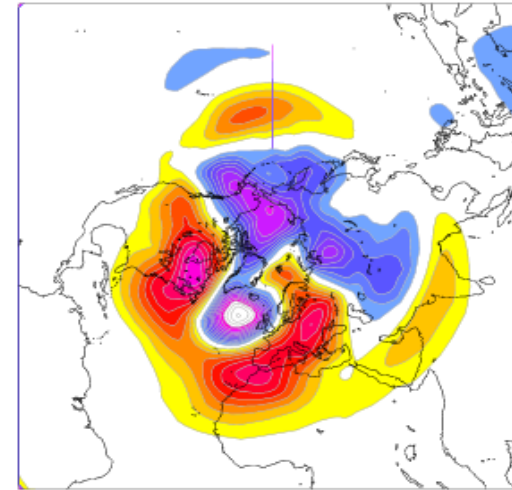
2002 MOFC hindcasts



2011 MOFC hindcasts

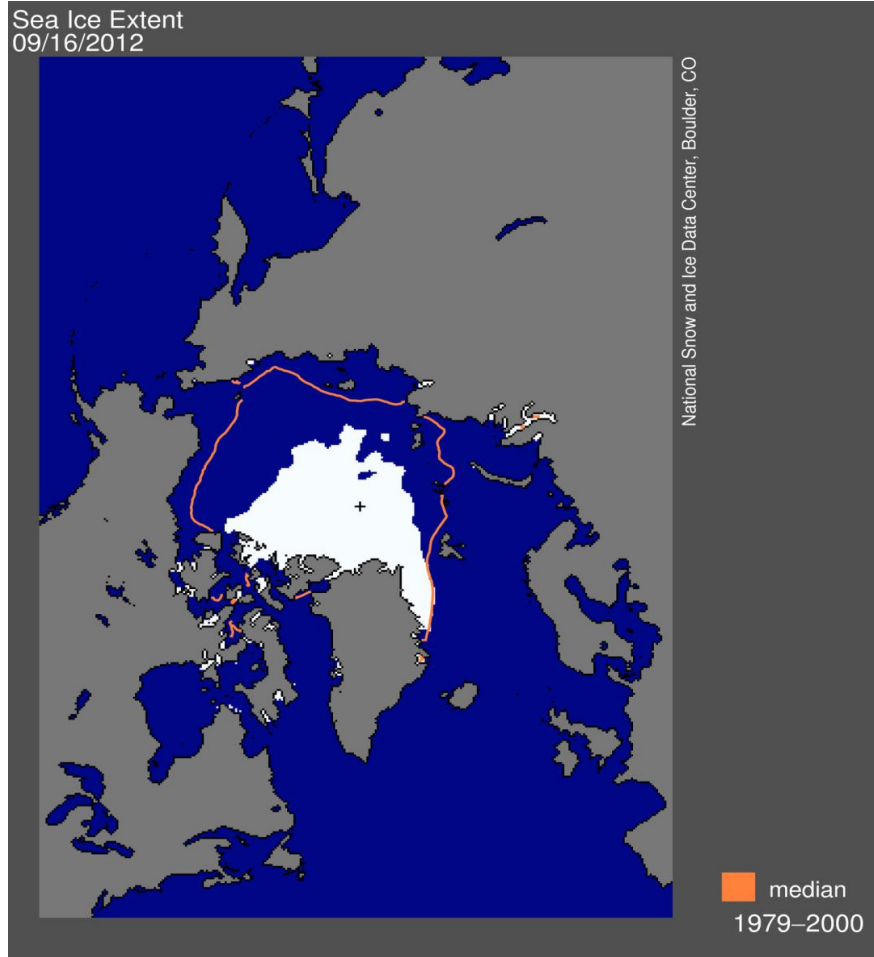


ERA Interim

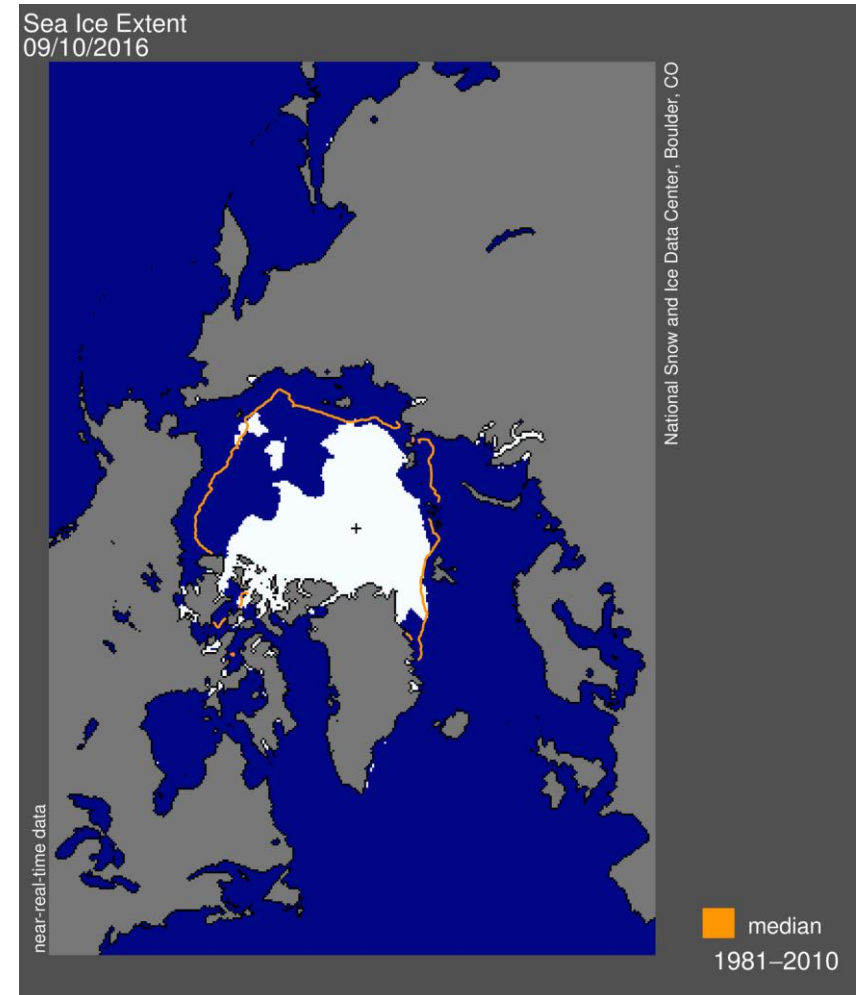


from Vitart 2014

Sea ice: Interaction of climate change and natural variability

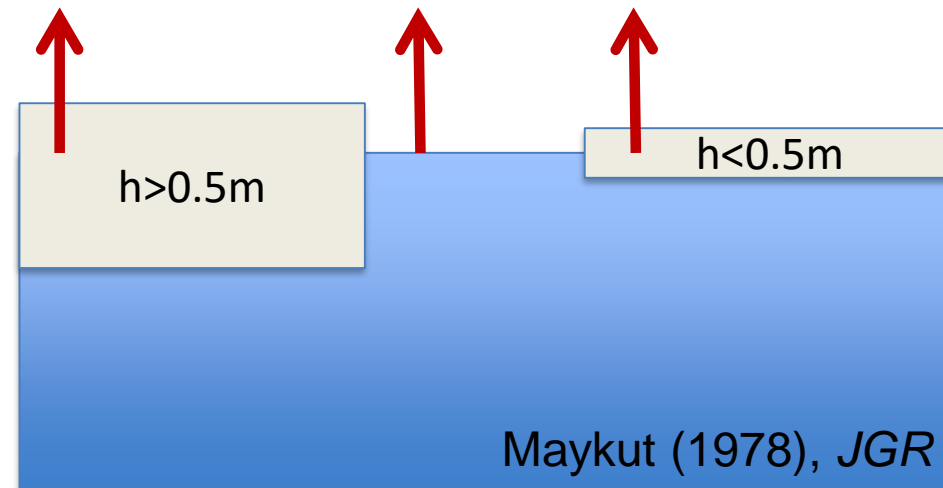


**Record minimum
in Arctic
sea-ice extent:
16/9/2012
(from NSIDC)**



Impacts of Sea Ice

- Energy Fluxes:
 - Changes albedo of the region – solar heating of upper ocean
 - Thickness of the sea ice alters the surface heat fluxes
 - Winter; biggest effect – no sun and air colder than ocean
 - Leads in the ice are important (Badgerley, 1966)



- Impact on waves
- Salinity fluxes:
 - Production of brine (freezing) and freshwater (melting)

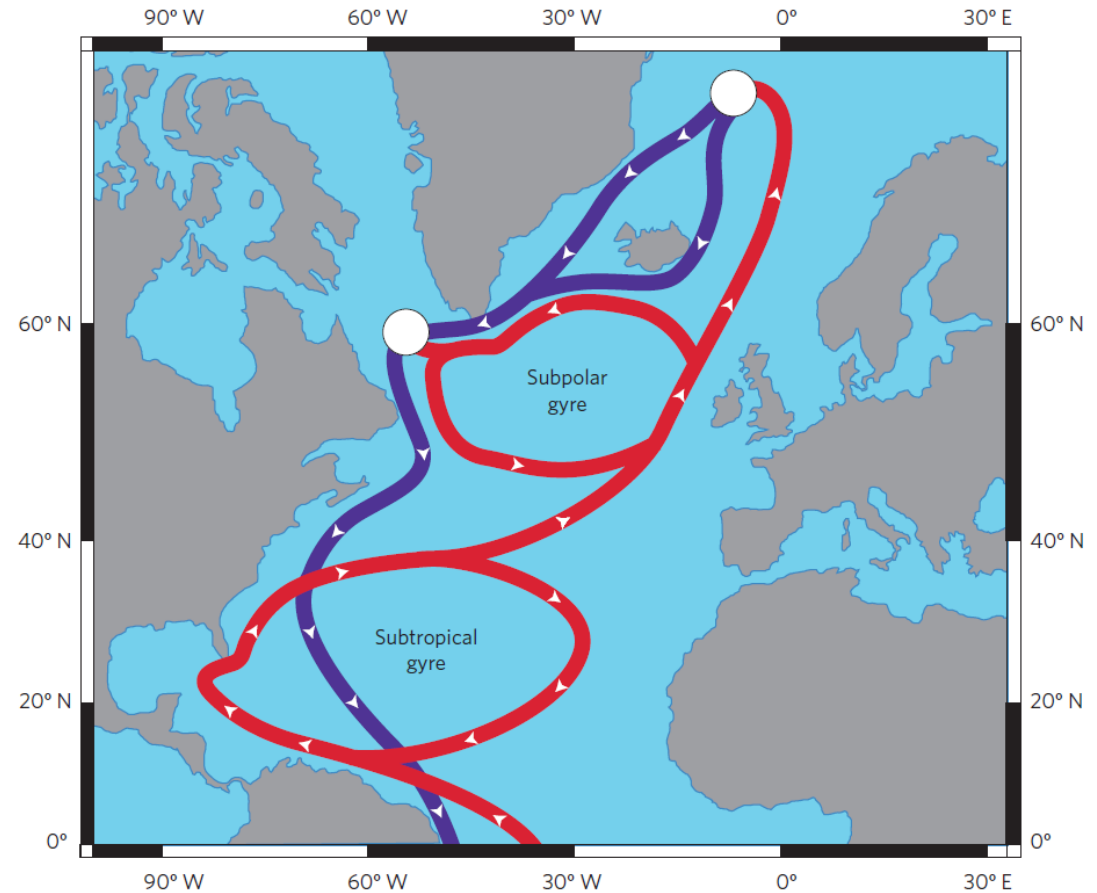
Impacts on the ocean

Deep convection:

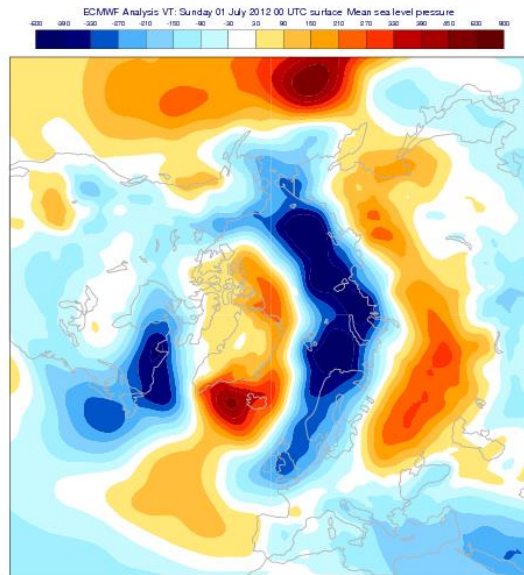
- More important on longer time scales
- Impact on the Gulf Stream and the Thermohaline circulation – part of the feedback on the Arctic system

Cold Halocline Layer:

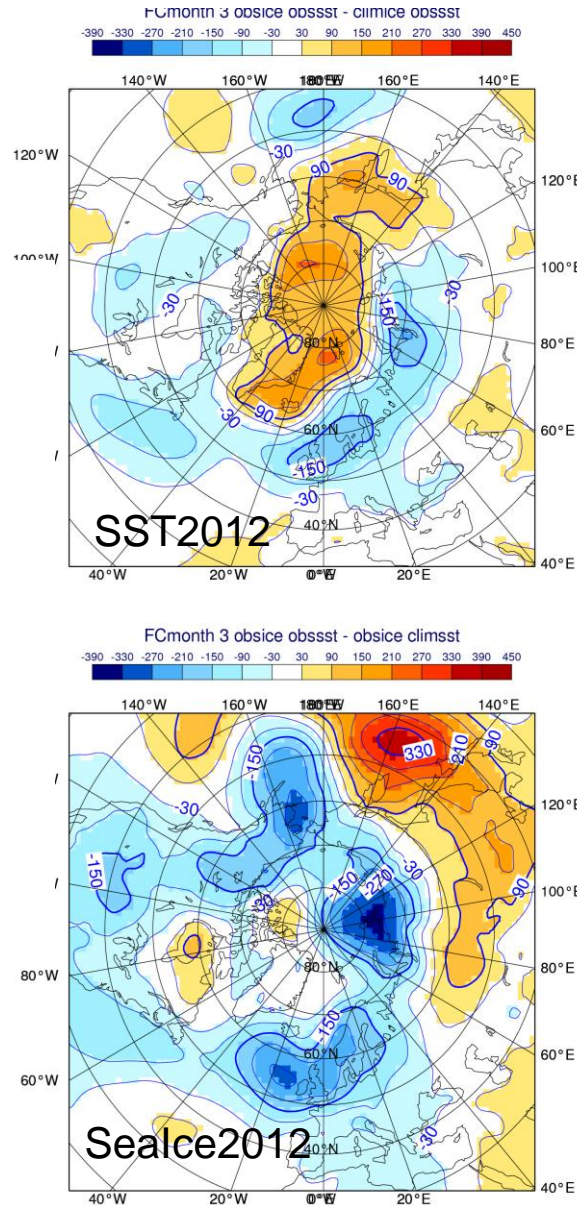
- Layer of freshwater that insulates sea ice from warmer waters that are advected into the basin



Sea Ice predictability experiment – July 2012



July MSLP anomaly
Era Interim 2012 - climatology



sea ice: 2012 - climatology



SST: 2012 - climatology



Conclusions

Regional anomalies in atmospheric flow and weather parameters may persist on time scales longer than the deterministic predictability limit, and have substantial societal impacts.

The possibility of performing probabilistic predictions of these events arises from the interaction of the atmospheric flow with slowly varying anomalies in surface conditions, which modify the energy and water sources for the atmosphere. We need to initialise and model the coupled phenomena important for atmospheric variability.

In the extratropics, persistent anomalies can be generated by (linear) teleconnections with tropical variability (eg ENSO) but also from the alternation of different (non-linear) flow regimes.

Ensemble prediction systems provide an estimate of long-range predictability based on the ratio of ensemble spread and ensemble-mean variability.

Predictability over Europe: limited by strong internal variability during winter (but with significant teleconnections on the sub-seasonal scale), higher in other seasons when internal variability is reduced.

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