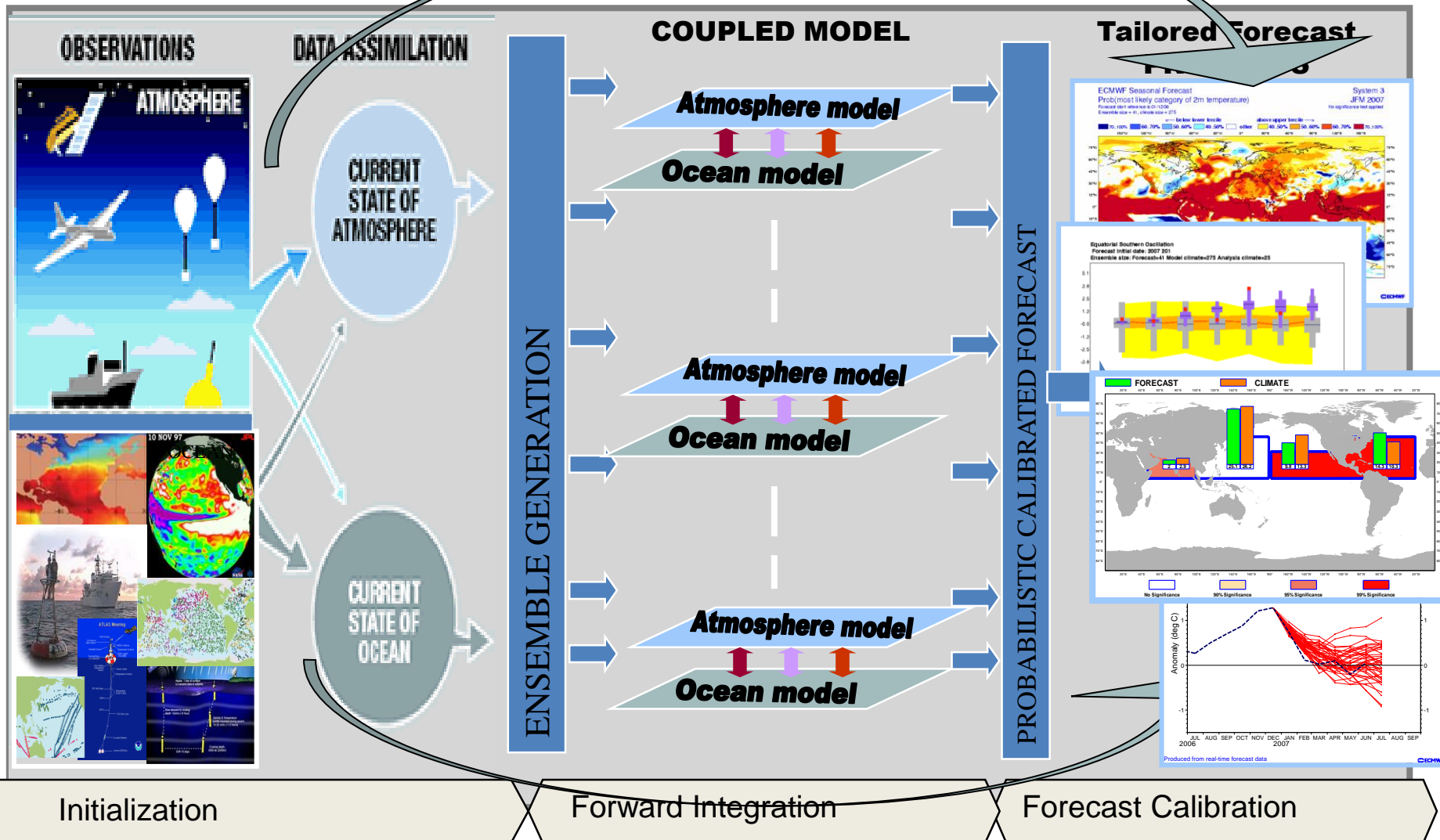


# S2S models and Database

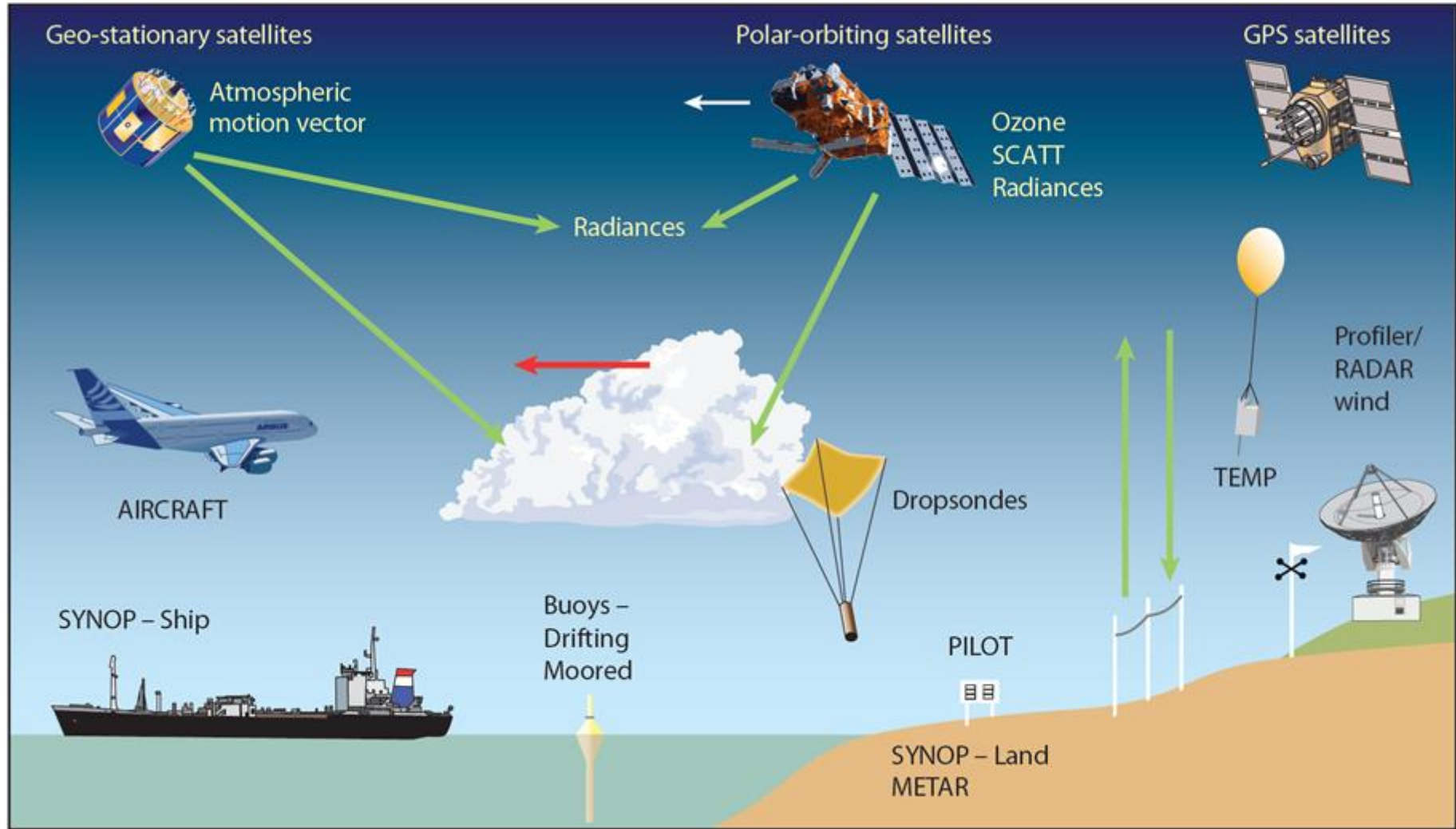
Frédéric Vitart

# **S2S Models**

# End-To-End forecasting System



# Informations to initialize the atmosphere

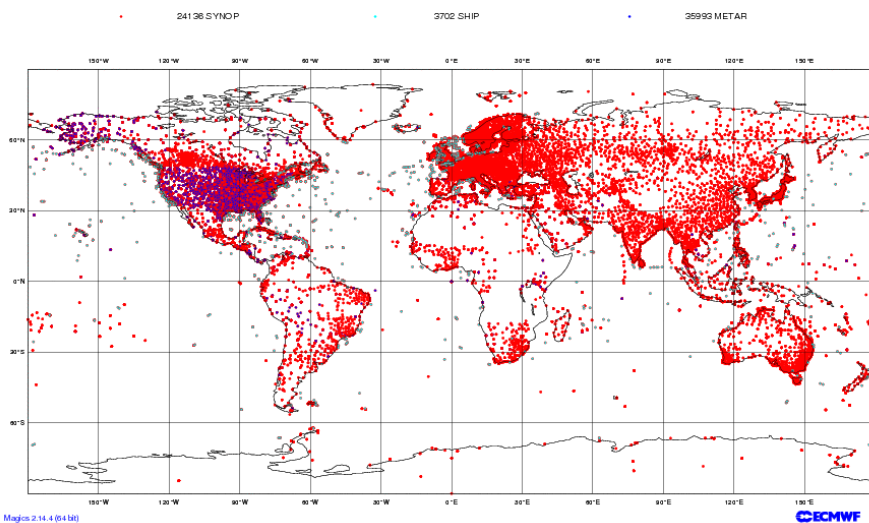


# Observations coverage and accuracy

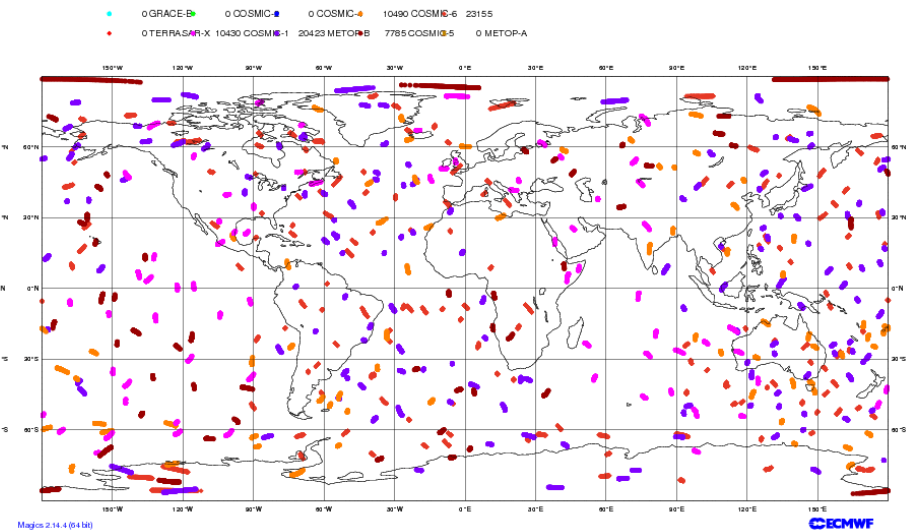
To make accurate forecasts it is important to know the current weather:

- ~ 155M obs (99% from satellites) are received daily;
- ~ 15M obs (96% from satellites) are used every 12 hours.

ECMWF Data Coverage (All obs DA) - Synop-Ship-Metar  
25/Feb/2015; 00 UTC  
Total number of obs = 63831



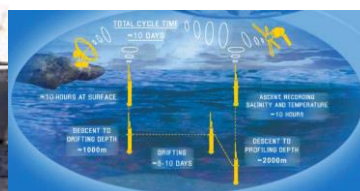
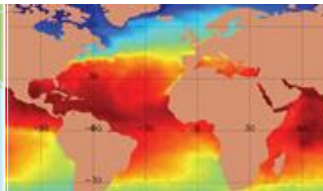
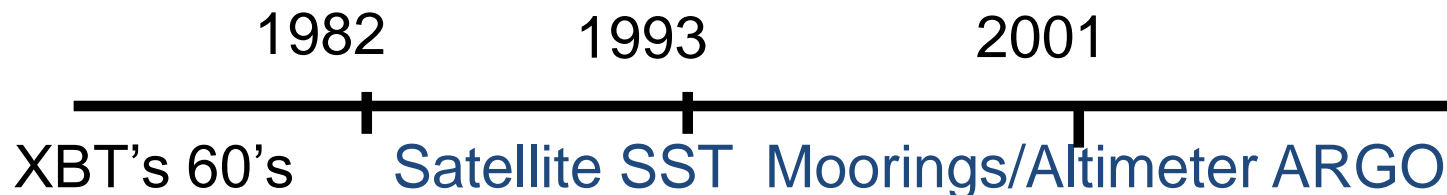
ECMWF Data Coverage (All obs DA) - GPSRO  
25/Feb/2015; 00 UTC  
Total number of obs = 72283



# Information to initialize the ocean

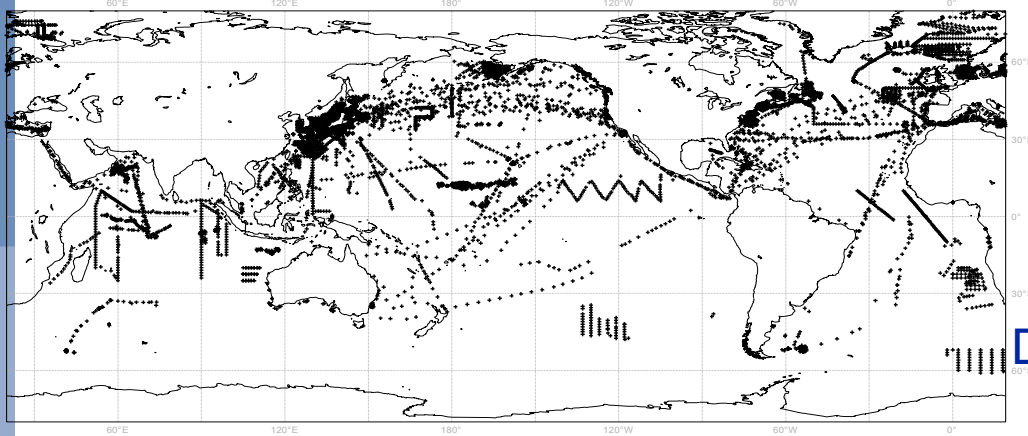
- Ocean model Plus:
  - SST
  - Atmospheric fluxes from atmospheric reanalysis
  - Subsurface ocean information

Time evolution of the Ocean Observing System



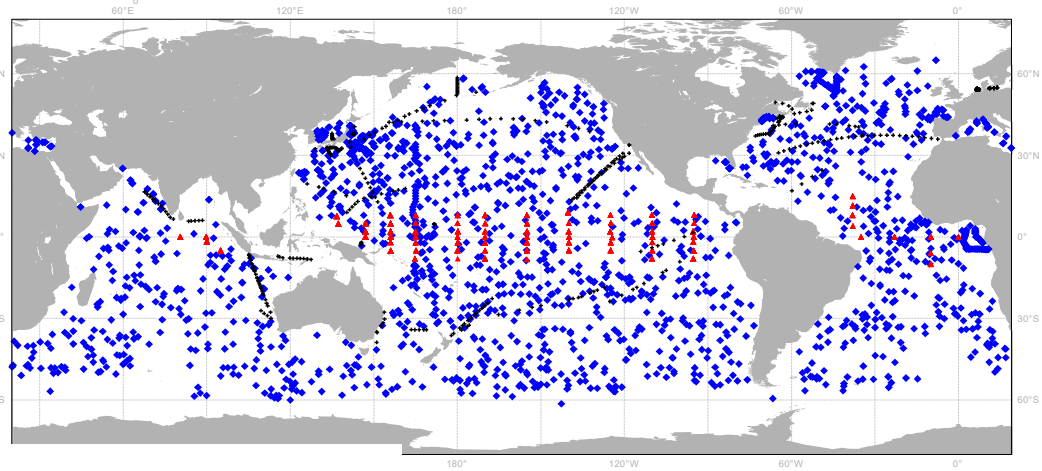
# Ocean observing system

## Data coverage for June 1982



Changing observing system is a challenge for consistent reanalysis

## Data coverage for Nov 2005



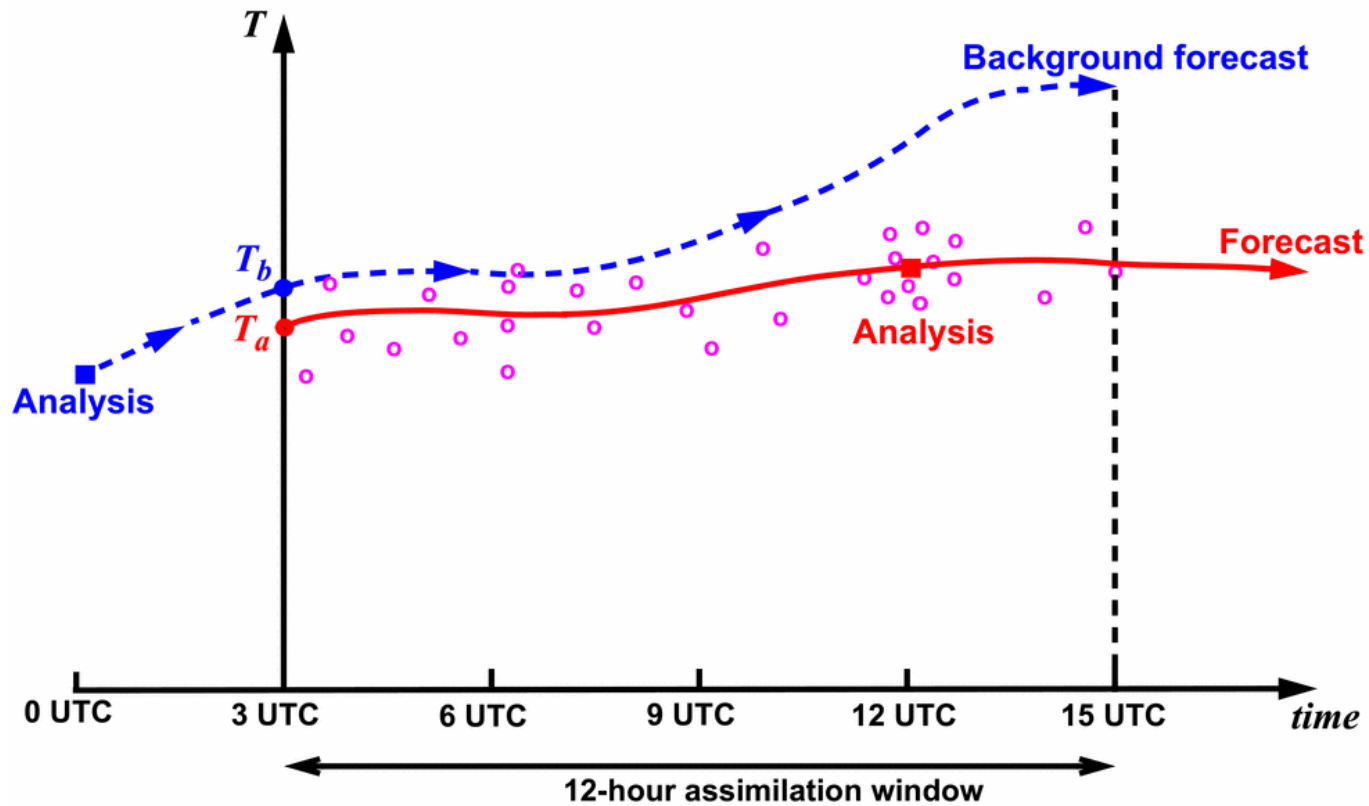
Today's Observations will be used in years to come

▲ Moorings: Subsurface Temperature

◇ ARGO floats: Subsurface Temperature and Salinity

+ XBT : Subsurface Temperature

# The ECMWF 4D-Var data-assimilation system





# ECMWF extended-range forecasts

---

- A 51-member ensemble is integrated for 46 days twice a week (Mondays and Thursdays at 00Z)
- Atmospheric component: IFS with the latest operational cycle and with a 18 km resolution up to day 15 and 36 km after day 15.
- Ocean-atmosphere coupling from day 0 to NEMO (about 1/4 degree) every hour.

## *Initial conditions:*

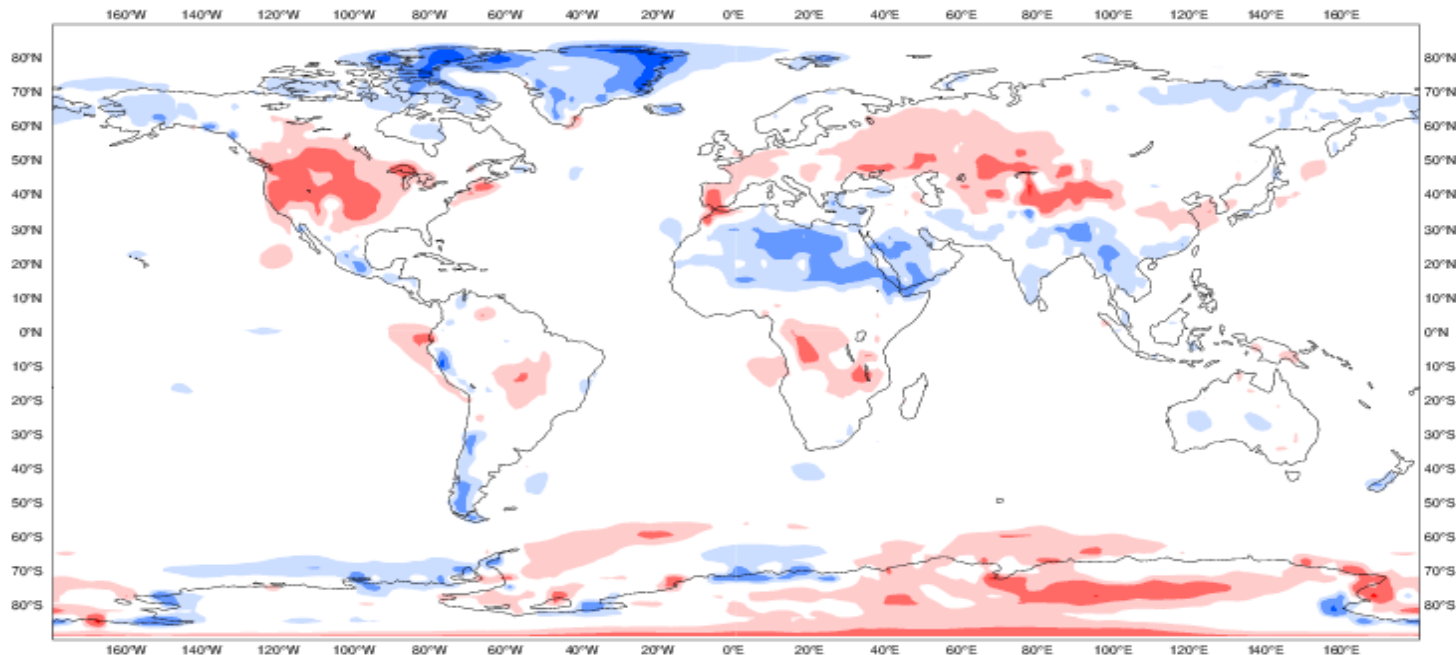
- Atmosphere: Operational 4-D var analysis + SVs+ EDA perturbations
- Ocean: 3D-Var analysis (NEMOVAR) + wind stress perturbations

# Model Biases

Biases (eg 2mT as shown here) are often comparable in magnitude to the anomalies which we seek to predict

gff1  
2-metre temperature Bias  
19890801-20140801

PERIOD:600-768



# Re-forecast strategy

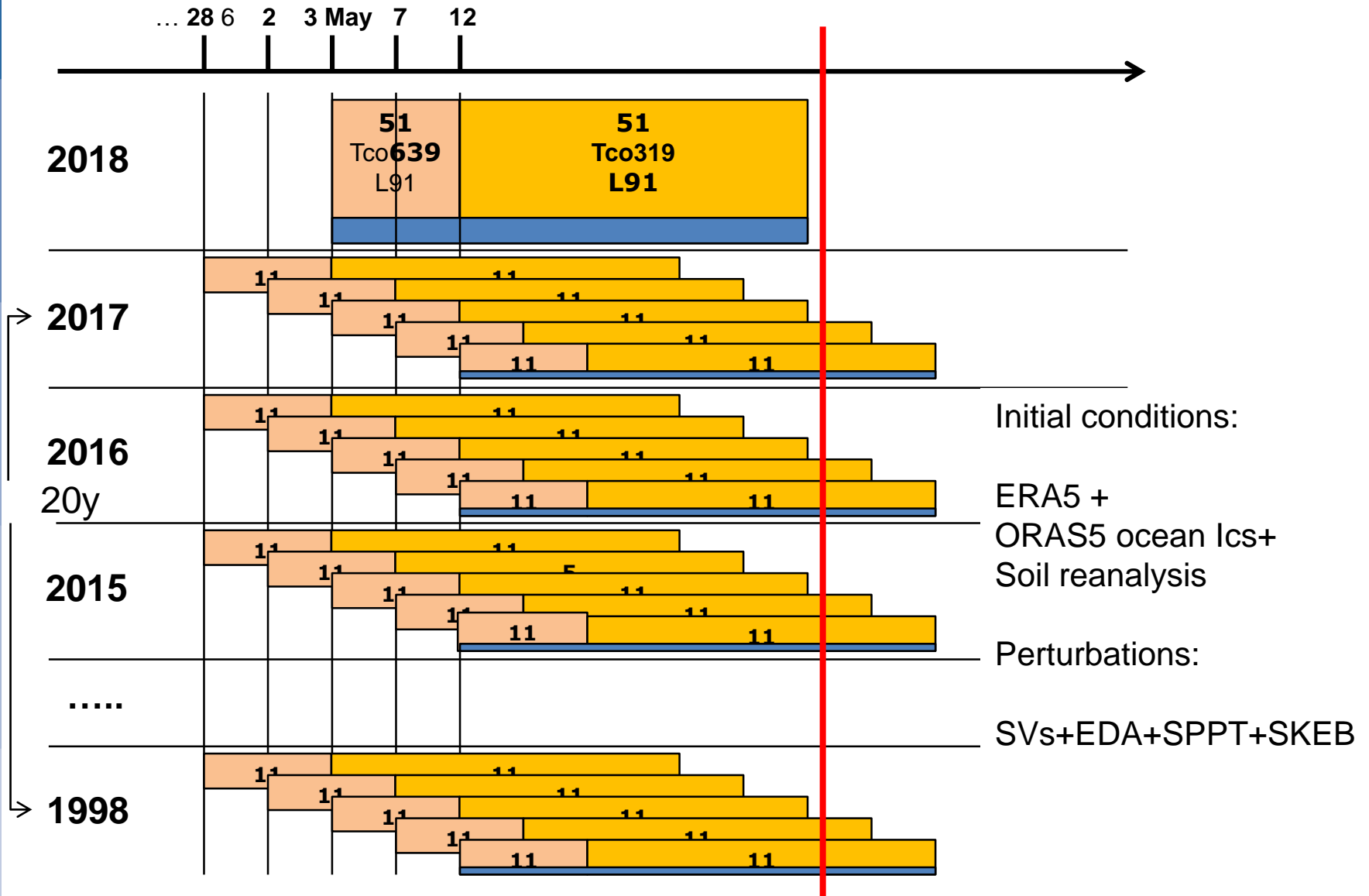
Re-forecasts are used for model calibration and also for skill assessment.

- A large reforecast database is needed for **calibration** to distinguish between random error and systematic errors and also to estimate flow dependent errors.
- A large reforecast database is also needed for verification and for flow dependant **skill assessment**, like assessing the concurrent impact of ENSO and specific phases of the MJO on the forecast skill scores. Signal to noise ration is also improved in long reforecast datasets (Shi et al, 2014)
- Large ensemble size is also important for skill assessment , since some probabilistic skill scores are impacted by the ensemble size.

However

- Large re-forecast datasets with large ensemble size are often not affordable. Not clear what is more important: ensemble size, number of years?
- Long re-forecasts suffer from inconsistent quality in the initial conditions (pre-sat. period).

# The ENS re-forecasts to estimate the M-climate



# Forecast Products

ECMWF EPS-Monthly Forecasting System

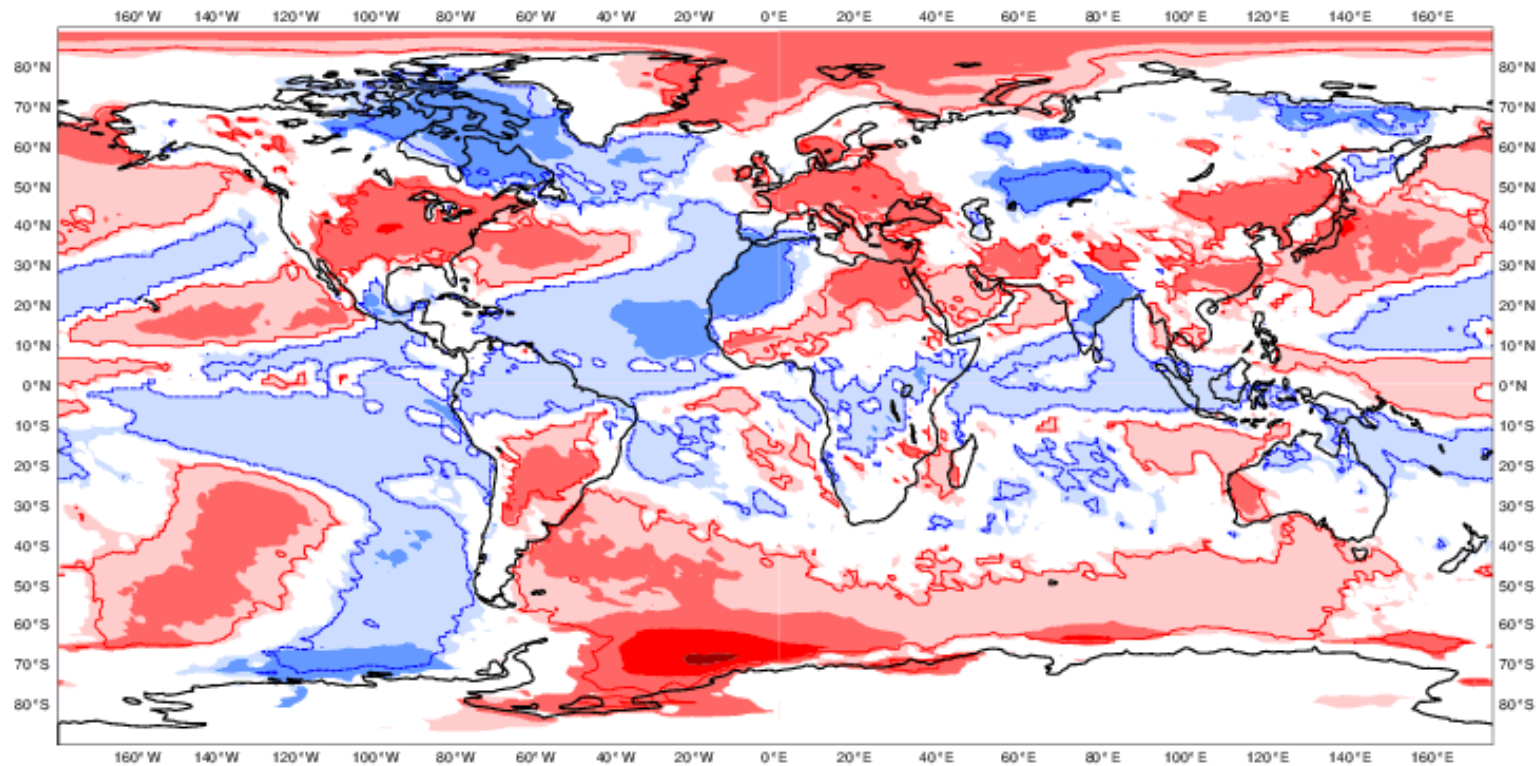
2-meter Temperature anomaly

Forecast start reference is 30-04-2018  
ensemble size = 51 , climate size = 660

Day 15-21

14-05-2018/TO/20-05-2018

Shaded areas significant at 10% level  
Contours at 1% level



Anomalies (temperature, precipitation..)

# S2S Database Models

## Forecasts

## Re-forecasts

Status on 5th January 2018	Time range	Resolution	Ens. Size	Frequency	Re-forecasts	Rfc length	Rfc frequency	Rfc size
<b>BoM (ammc)</b>	d 0-62	T47L17	3*11	2/week	fix	1981-2013	6/month	3*11
<b>CMA (babj)</b>	d 0-60	T106L40	4	daily	fix	1994-2014	daily	4
<b>CNR-ISAC (isac)</b>	d 0-32	0.75x0.56 L54	41	weekly	fix	1981-2010	every 5 days	5
<b>CNRM (lfpw)</b>	d 0-32	T255L91	51	weekly	fix	1993-2014	2/month	15
<b>ECCC (cwao)</b>	d 0-32	0.45x0.45 L40	21	weekly	on the fly	1995-2014	weekly	4
<b>ECMWF (ecmf)</b>	d 0-46	Tco639/319 L91	51	2/week	on the fly	past 20 years	2/week	11
<b>HMCR (rums)</b>	d 0-61	1.1x1.4 L28	20	weekly	on the fly	1985-2010	weekly	10
<b>JMA (rjtd)</b>	d 0-33	TI479/TI319L100	50	weekly	fix	1981-2010	3/month	5
<b>KMA (rksl)</b>	d 0-60	N216L85	4	daily	on the fly	1991-2010	4/month	3
<b>NCEP (kwbc)</b>	d 0-44	T126L64	16	daily	fix	1999-2010	day	4
<b>UKMO (egrr)</b>	d 0-60	N216L85	4	daily	on the fly	1993-2015	4/month	7

see [s2sprediction.net](http://s2sprediction.net) for details and to access data

# S2S Database Models

## Forecasts

## Re-forecasts

Status on 5th January 2018	Time range	Resolution	Ens. Size	Frequency	Re-forecasts	Rfc length	Rfc frequency	Rfc size
<b>BoM (ammc)</b>	d 0-62	T47L17	3*11	2/week	fix	1981-2013	6/month	3*11
<b>CMA (babj)</b>	d 0-60	T106L40	4	daily	fix	1994-2014	daily	4
<b>CNR-ISAC (isac)</b>	d 0-32	0.75x0.56 L54	41	weekly	fix	1981-2010	every 5 days	5
<b>CNRM (lfpw)</b>	d 0-32	T255L91	51	weekly	fix	1993-2014	2/month	15
<b>ECCC (cwao)</b>	d 0-32	0.45x0.45 L40	21	weekly	on the fly	1995-2014	weekly	4
<b>ECMWF (ecmf)</b>	d 0-46	Tco639/319 L91	51	2/week	on the fly	past 20 years	2/week	11
<b>HMCR (rums)</b>	d 0-61	1.1x1.4 L28	20	weekly	on the fly	1985-2010	weekly	10
<b>JMA (rjtd)</b>	d 0-33	T1479/TI319L100	50	weekly	fix	1981-2010	3/month	5
<b>KMA (rksl)</b>	d 0-60	N216L85	4	daily	on the fly	1991-2010	4/month	3
<b>NCEP (kwbc)</b>	d 0-44	T126L64	16	daily	fix	1999-2010	day	4
<b>UKMO (egrr)</b>	d 0-60	N216L85	4	daily	on the fly	1993-2015	4/month	7

All models have produce a real-time forecast every Thursday!

# S2S Database Models

## Forecasts

## Re-Forecasts

Status on 5th January 2018	Time range	Resolution	Ens. Size	Frequency	Re-forecasts	Rfc length	Rfc frequency	Rfc size
<b>BoM (ammc)</b>	d 0-62	T47L17	3*11	2/week	fix	1981-2013	6/month	3*11
<b>CMA (babj)</b>	d 0-60	T106L40	4	daily	fix	1994-2014	daily	4
<b>CNR-ISAC (isac)</b>	d 0-32	0.75x0.56 L54	41	weekly	fix	1981-2010	every 5 days	5
<b>CNRM (lfpw)</b>	d 0-32	T255L91	51	weekly	fix	1993-2014	2/month	15
<b>ECCC (cwao)</b>	d 0-32	0.45x0.45 L40	21	weekly	on the fly	1995-2014	weekly	4
<b>ECMWF (ecmf)</b>	d 0-46	Tco639/319 L91	51	2/week	on the fly	past 20 years	2/week	11
<b>HMCR (rums)</b>	d 0-61	1.1x1.4 L28	20	weekly	on the fly	1985-2010	weekly	10
<b>JMA (rjtd)</b>	d 0-33	T1479/TI319L100	50	weekly	fix	1981-2010	3/month	5
<b>KMA (rksl)</b>	d 0-60	N216L85	4	daily	on the fly	1991-2010	4/month	3
<b>NCEP (kwbc)</b>	d 0-44	T126L64	16	daily	fix	1999-2010	day	4
<b>UKMO (egrr)</b>	d 0-60	N216L85	4	daily	on the fly	1993-2015	4/month	7

**Common re-forecast period is 1999-2010!**



# Re-forecasts

---

Two strategies for re-forecasts in S2S database:

- **Fixed re-forecasts** (e.g. NCEP/BoM/JMA)

The model version used to produce the sub-seasonal forecasts is “frozen” for a number of years (e.g. CFS2). The re-forecasts have been produced once for all before the system became operational.

**Advantage:** More user friendly. The user can compute skill and calibration once for all.

- **“on the fly” re-forecasts** (e.g. ECMWF/UKMO/ECC..)

The model version changes frequently (at least once a year). Therefore re-forecasts have to be produced regularly since the model version of the re-forecasts has to be the same as the real-time forecasts.

**Advantage:** This methodology ensures the best model version has been used to produce the sub-seasonal forecasts.

# Re-forecasts

---

Re-forecasts are assigned 2 dates:

- Model version date (date of production of the data)
- Hindcast date (start date of the re-forecast)

For fixed re-forecasts, Model version date is fixed (e.g. 20110301 for NCEP)

For on-the-fly re-forecasts, Model version date = YYYY-MM-DD

where YYYY= year of data production and MM-DD are same month and day as Hindcast date

For example, the ECMWF hindcast starting on 20000101 which was produced in 2019 is referred to as:

- Model version date = 20190101
- Hindcast date = 20000101

# S2S Database

# Model Description (s2s.ecmwf.int)

Pages / Home / Description

[Edit](#) [Save for later](#) [Watching](#) [Share](#)

## Models

Created by Richard Mladek, last modified by Craig MacLachlan on Jan 25, 2017

This table shows the centres that provide data to this project together with the **latest** configuration of their systems. Follow the link of each Data Provider for specific model description.

Status on 26th January 2017	Time range	Resolution	Ens. Size	Frequency	Re-forecasts	Rfc length	Rfc frequency	Rfc size	Volume of real-time forecast per cycle	Volume of reforecast per update
<a href="#">BoM (ammc)</a>	d 0-62	T47L17	33	2/week	fix	1981-2013	6/month	33		6 TB
<a href="#">CMA (babj)</a>	d 0-60	T106L40	4	daily	fix	1994-2014	daily	4		
<a href="#">CNR-ISAC (isac)</a>	d 0-31	0.75x0.56 L54	41	weekly	fix	1981-2010	every 5 days	1		
<a href="#">CNRM (lfpw)</a>	d 0-32	T255L91	51	weekly	fix	1993-2014	2/month	15		6.75 GB/start date
<a href="#">ECCC (cwao)</a>	d 0-32	0.45x0.45 L40	21	weekly	on the fly	1995-2014	weekly	4		
<a href="#">ECMWF (ecmf)</a>	d 0-46	Tco639/319 L91	51	2/week	on the fly	past 20 years	2/week	11		
<a href="#">HMCR (rums)</a>	d 0-61	1.1x1.4 L28	20	weekly	on the fly	1985-2010	weekly	10		
<a href="#">JMA (rjtd)</a>	d 0-33	T319L60	25	2/week	fix	1981-2010	3/month	5	3.8 GB	900 GB
<a href="#">KMA (rksl)</a>	d 0-60	N216L85	4	daily	on the fly	1991-2010	4/month	3		
<a href="#">NCEP (kwbc)</a>	d 0-44	T126L64	16	daily	fix	1999-2010	day	4		
<a href="#">UKMO (egrr)</a>	d 0-60	N216L85	4	daily	on the fly	1993-2015	4/month	7		

### Retrieval efficiency

- In order to retrieve data efficiently users should follow the instructions about [S2S reforecasts retrieval efficiency](#).
- Find links [here](#) to the efficient retrieval scripts for different S2S datasets via [ECMWF Web API](#)

 Like 7 people like this

No labels 

# Model description

Implementation Date in S2S	Model version	Time range	Atmosphere Resolution	Ens. Size	Frequency	Re- forecasts	Rfc length	Time range Atmosphere Resolution	Rfc size	Ocean Resolution	Active Sea Ice
01/01/2015	CY40R1	d 0-32		51	2/week Mon/Thu	on the fly	past 20 years	once a week (Thu real- time)	5	1 degree	No
14/05/2015	CY41R1	d 0-46	32 km up to day 10 64 km after day 10	51	2/week Mon/Thu	on the fly	past 20 years	2/week (Mon/Thu real time)	11	1 degree	No
08/03/2016	CY41R2	d 0-46	16 km up to day 15 31 km after day 15	51	2/week Mon/Thu	on the fly	past 20 years	2/week (Mon/Thu real time)	11	1 degree	No
22/11/2016	CY43R1	d 0-46	16 km up to day 15 31 km after day 15	51	2/week Mon/Thu	on the fly	past 20 years	2/week (Mon/Thu real time)	11	1/4 degree	Yes
11/07/2017	CY43R3	d 0-46	16 km up to day 15 31 km after day 15	51	2/week Mon/Thu	on the fly	past 20 years	2/week (Mon/Thu real time)	11	1/4 degree	Yes
06/06/2018	CY45R1	d 0-46	16 km up to day 15 31 km after day 15	51	2/week Mon/Thu	on the fly	past 20 years	2/week (Mon/Thu real time)	11	1/4 degree	Yes
11/06/2019	CY46R1	d 0-46	16 km up to day 15 31 km after day 15	51	2/week Mon/Thu	on the fly	past 20 years	2/week (Mon/Thu real time)	11	1/4 degree	Yes

# A few important links:

---

**S2S project webpage:**

[s2sprediction.net](https://s2sprediction.net)

**S2S data portal + documentation at ECMWF:** [s2s.ecmwf.int](https://s2s.ecmwf.int)

**S2S data portal at CMA:**

[s2s.cma.cn](https://s2s.cma.cn)

## Issues with data

Created by Matthew Manoussakis, last modified by Manuel Fuentes on Aug 09, 2016

- **Meteo-France (lfpw)**
  - **Interpolation error in ALL data between 19 May and 16 June 2016**
- **BoM (ammc)**
  - **Wrong maximum values of surface air maximum temperature (Tmax) at some points for BoM data**
  - **Problem with sea-ice cover in BoM re-forecast data**
- **CMA (babj)**
  - **Problem with sea-ice cover in CMA re-forecast data. Fixed 31st March 2016**
  - **Problem with initial conditions CMA real-time data in January 2015 and 2016. Fixed 24th May 2016**

### Meteo-France (lfpw)

**Interpolation error in ALL data between 19 May and 16 June 2016**

#### 1. Brief description:

All S2S parameters were affected in that period. The corrected data was re-archived **on June 17 2016**.

The problem on the provider's side was caused by a bug in the last versions of EMOS and MARS (issued in March) that was

#### **2. Recommendation:**

If lfpw data from the given period was downloaded in the period 19.5.2016-17.6.2016, it should be deleted and the correct v

### BoM (ammc)

**Wrong maximum values of surface air maximum temperature (Tmax) at some points for BoM data**

#### 1. Brief description:

Some **coastal grid points** may display **unrealistic** Tmax values. All of the spurious Tmax points are **flagged** as being oc

#### **2. Recommendation:**

To **eliminate** the spurious values, use Tmax over **land points only**, based on POAMA's land-sea mask .

*\* POAMA stands for Predictive Ocean Atmosphere Model for Australia.*





# STEP 1: REGISTER

---

Register from ECMWF data portal

- First name/last name/email address
- Accept term and conditions of use of the database

# Two ways to get S2S data

---

- **Web INTERFACE:** <http://apps.ecmwf.int/datasets/data/s2s/>

This is a “discovery” tool. Recommended for first time users. It gives a good idea of the content of the database, its structure and most importantly what is available. Easy to use. Good for small retrievals.

- **WEBAPI:** <https://software.ecmwf.int/wiki/display/WEBAPI/WebAPI+FAQ>

This is a more advanced tool for data retrieval. Users install a “webapi key” on their computer. This allows them to run scripts to perform intensive S2S data retrievals. Recommended for advanced users with intensive data retrievals. Retrievals can be optimized.

# WEB INTERFACE: <http://apps.ecmwf.int/datasets/data/s2s>

The screenshot shows the S2S web interface in Mozilla Firefox. The browser tabs include 'Home | S2S Project', 'S2S, Realtime, Instantaneous and Accumulated', and 'Connecting...'. The address bar shows the URL `apps.ecmwf.int/datasets/data/s2s/`. The page title is 'S2S, Realtime, Instantaneous and Accumulated'. A sidebar on the left contains navigation links for 'S2S sets', 'Origin', 'Statistical process', 'Type or level', 'Type', 'About', 'Navigation', and 'See also...'. The main content area has a title 'S2S, Realtime, Instantaneous and Accumulated' and a note that the dataset is available on Mondays and Thursdays. It features three main selection sections: 'Select date' with a date range from 2015-01-01 to 2015-10-26 and a monthly selection grid; 'Select step' with a grid of step values from 0 to 1060; and 'Select parameter' with radio buttons for various atmospheric variables like wind components, precipitation, and temperature.

S2S sets  
Real time  
Retcasts

Origin  
BoM  
CMA

ESMVP  
HMCR  
JMA  
Météo France  
NCEP

Statistical process  
Real time instantaneous and accumulated  
Real time daily averaged

Type or level  
Potential temperature  
Pressure levels  
Surface

Type  
Control forecast  
Perturbed forecast

About  
Conditions of use  
Documentation

Navigation  
Public Datasets  
Job list

See also...  
Access Public Datasets  
General FAQ  
WebAPI FAQ  
Accessing Forecasts  
GRIB decoder

## S2S, Realtime, Instantaneous and Accumulated

This dataset is available Mondays and Thursdays. [read more](#)

Select date  
Select a date in the interval 2015-01-01 to 2015-10-26  
Start date: [2015-01-01] End date: [2015-10-26]  
[Reset](#)

Select a list of months

2015	Jan	Feb	Mar	Apr	May	Jun	Jul	Aug	Sep	Oct	Nov	Dec
2016	Jan	Feb	Mar	Apr	May	Jun	Jul	Aug	Sep	Oct	Nov	Dec

[Select All](#) or [Clear](#)

Select step

0	6	12	18	24	30	36	42	48	54	60	66
72	78	84	90	96	102	108	114	120	126	132	138
144	150	156	162	168	174	180	186	192	198	204	210
216	222	228	234	240	246	252	258	264	270	276	282
288	294	300	306	312	318	324	330	336	342	348	354
360	366	372	378	384	390	396	402	408	414	420	426
432	438	444	450	456	462	468	474	480	486	492	498
504	510	516	522	528	534	540	546	552	558	564	570
576	582	588	594	600	606	612	618	624	630	636	642
648	654	660	666	672	678	684	690	696	702	708	714
720	726	732	738	744	750	756	762	768	774	780	786
792	798	804	810	816	822	828	834	840	846	852	858
864	870	876	882	888	894	900	906	912	918	924	930
936	942	948	954	960	966	972	978	984	990	996	1002
1008	1014	1020	1026	1032	1038	1044	1050	1056	1062	1068	1074
1080	1086	1092	1098	1104							

[Select All](#) or [Clear](#)

Select parameter

<input type="radio"/> 10 m U wind component	<input type="radio"/> 10 m U wind component
<input type="radio"/> Convective precipitation	<input type="radio"/> Eastward turbulent surface stress
<input type="radio"/> Land-sea mask	<input type="radio"/> Maximum temperature at 2 metres in the last 6 hours
<input type="radio"/> Mean sea level pressure	<input type="radio"/> Minimum temperature at 2 metres in the last 6 hours
<input type="radio"/> Northward turbulent surface stress	<input type="radio"/> Orography

# Getting DATA from scripts: WEBAPI

WEBAPI is an application programming interface (API) for a web server. It allows to download S2S data directly from you computer using PYTHON scripts.

- You may start with the examples available on S2S sample scripts or by creating your request using the S2S Datasets Web Interface .
- Please note the following:
  - We strongly advice you to start with a simple request. ( 1-2 parameters 1 time step 1-2 steps etc)
  - The PYTHON request will be a dictionary with "keys" and "values" that represent your selection. (eg "step":"00", "time": 00")
  - The request is strongly connected to the availability of the data



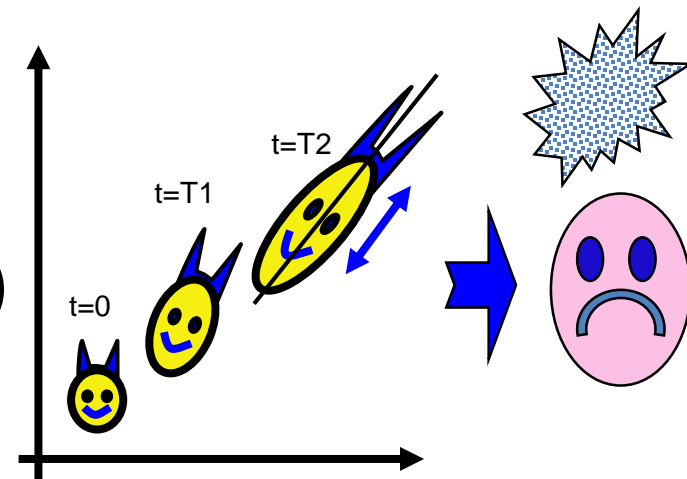
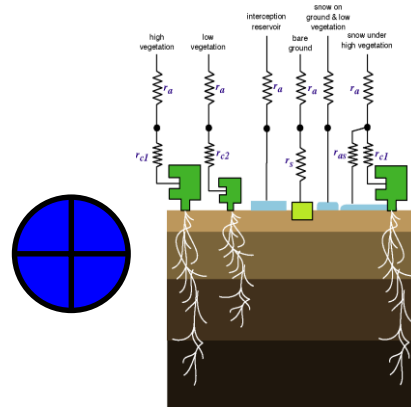
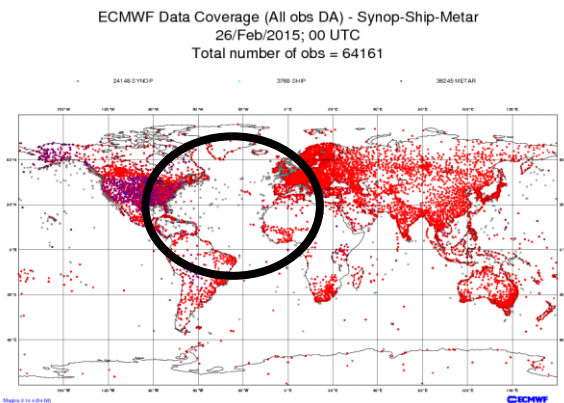


# Why ensemble prediction?

# Why do forecasts fail?

Forecasts can fail because:

- The initial conditions are not accurate enough, e.g. due to poor coverage and/or observation errors, or errors in the assimilation (initial uncertainties).
- The model used to assimilate the data and to make the forecast describes only in an approximate way the true atmospheric phenomena (model uncertainties).



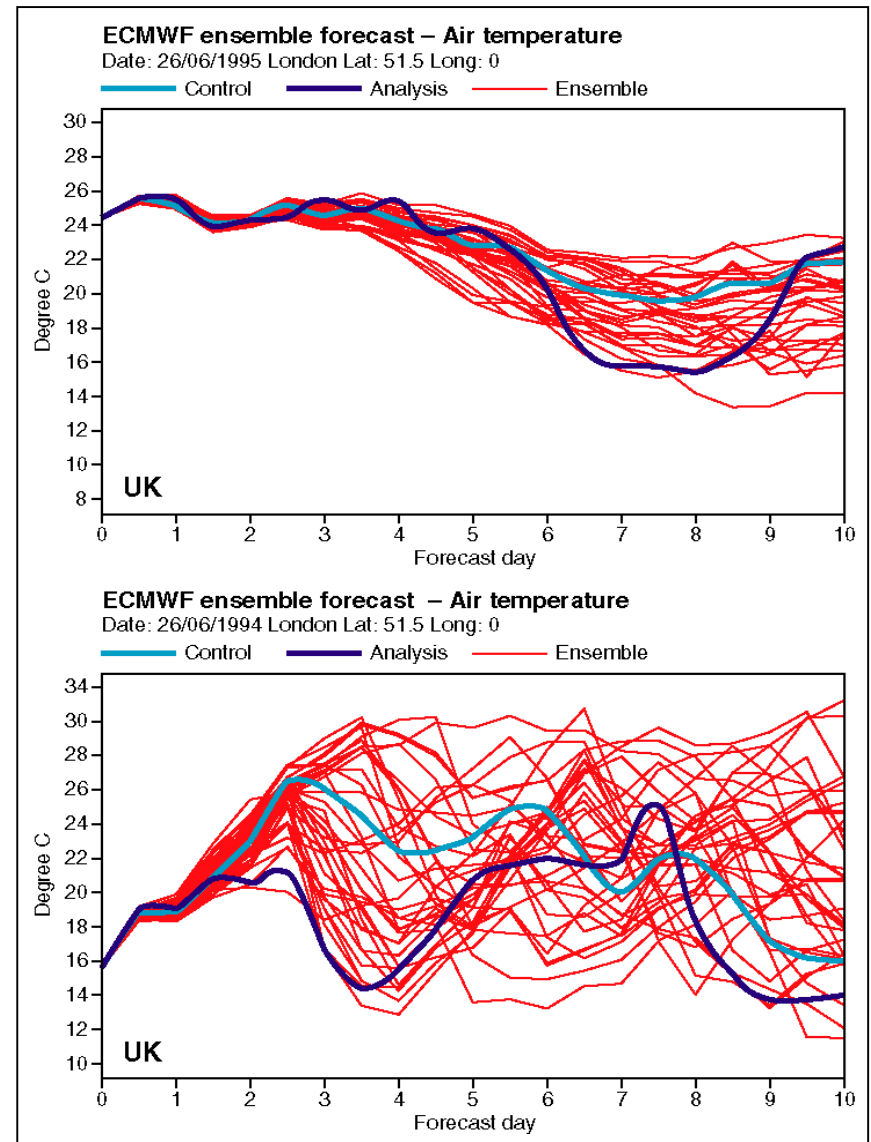
# Chaos and weather prediction

The atmosphere is a chaotic system

- Small errors can grow to have major impact
- We can never perfectly measure the current state of the whole atmosphere

Ensemble Forecasts

- Parallel set of forecasts from slightly different initial conditions and model formulation
- Assess uncertainty of today's forecast





# What is the aim of ensemble forecasting?

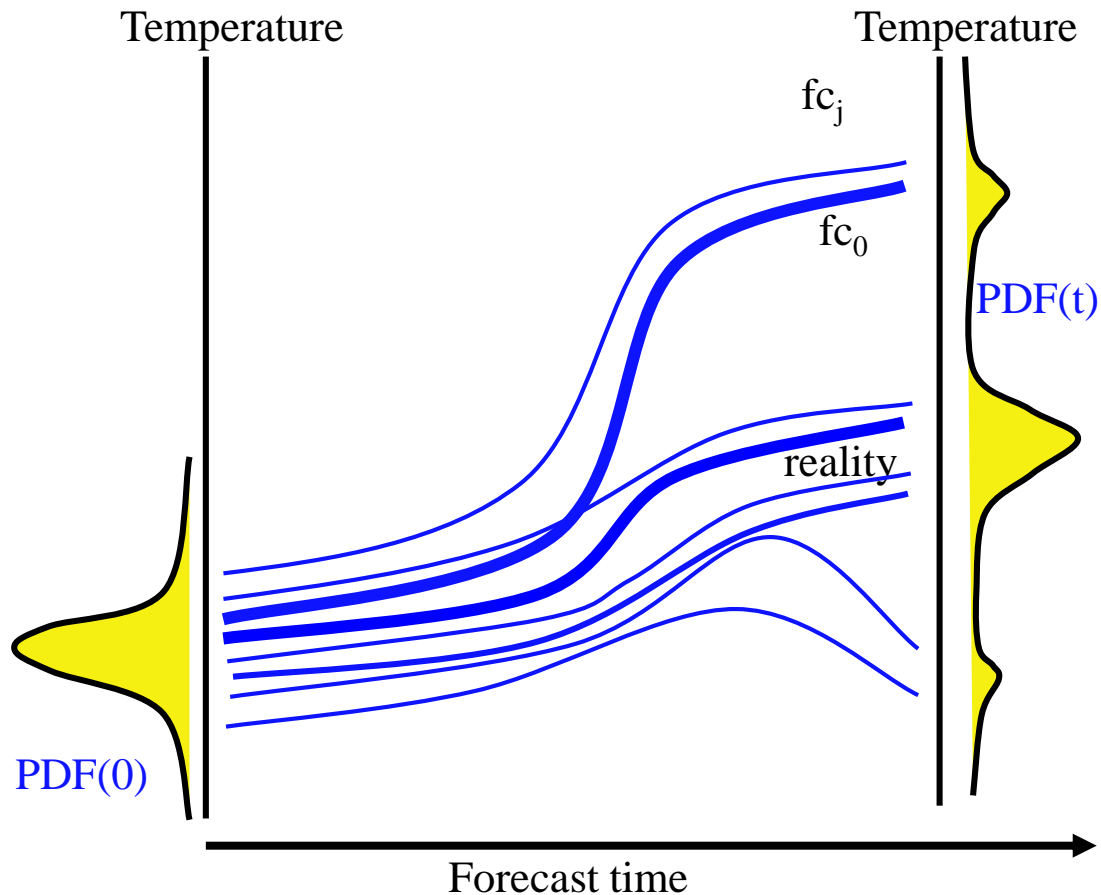
We have seen that single forecasts can fail due to a combination of **initial** and **model uncertainties**, and that the NWP problem is made extremely complex by the **chaotic nature of the atmosphere**.

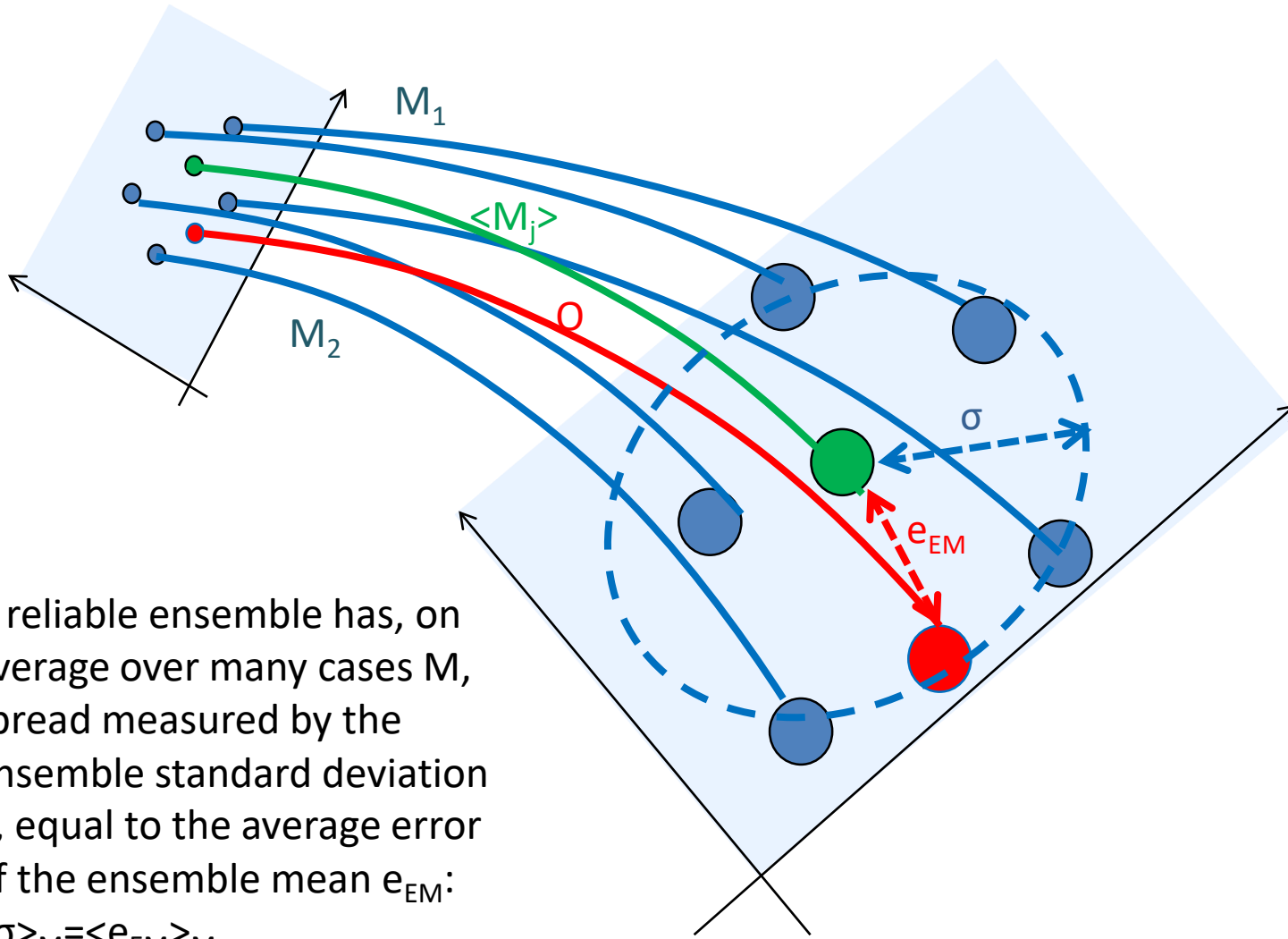
- Does it make sense to issue single forecasts?
- Can something better be done?
- More generally, what is the aim of weather and climate forecasting?
- Should it be to predict only the most likely scenario, or should it aim to predict also its uncertainty (give a 'confidence band'), for example expressed in terms of weather scenarios or probabilities that different weather conditions can occur?

# Ensemble prediction

Ensemble prediction aims to estimate the probability density function of forecast states, taking into account all possible sources of forecast error:

- ❖ Observation errors and imperfect boundary conditions
- ❖ Data assimilation assumptions
- ❖ Model errors





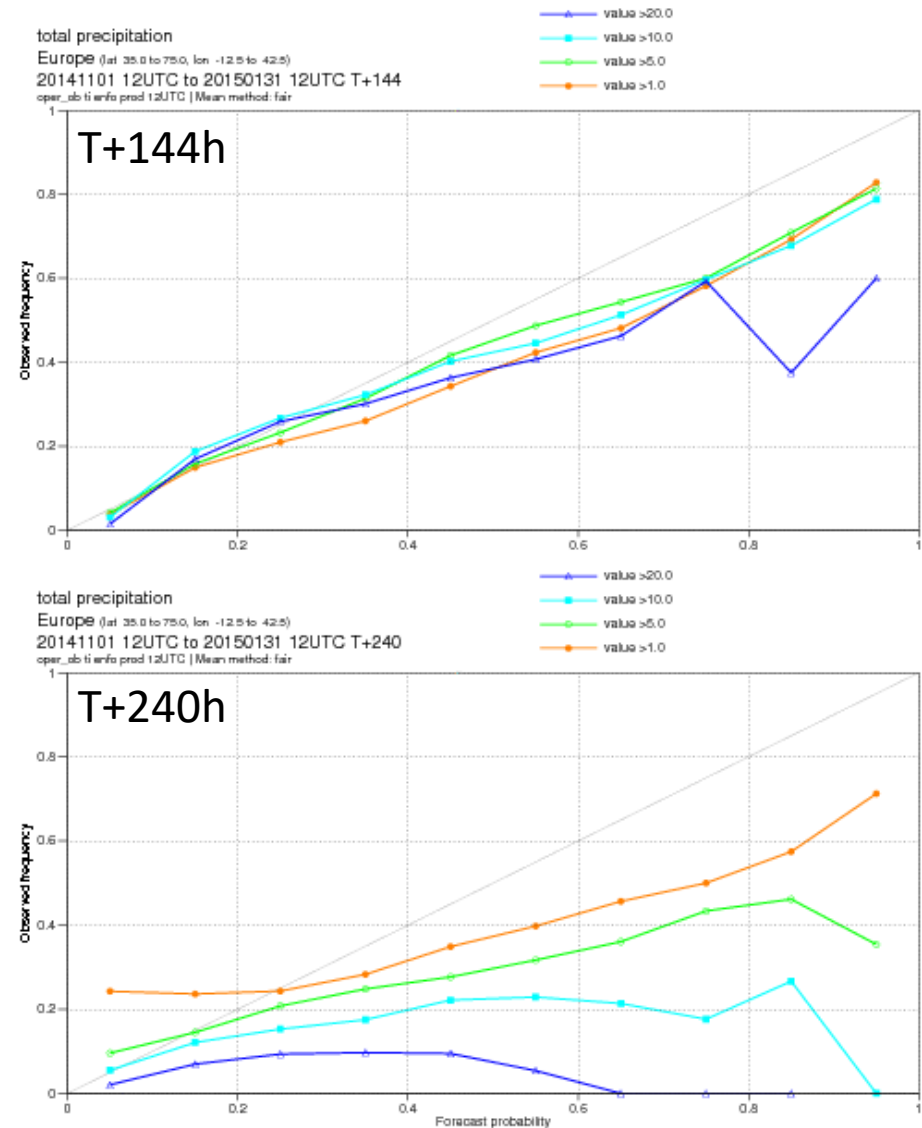
A reliable ensemble has, on average over many cases  $M$ , spread measured by the ensemble standard deviation  $\sigma$ , equal to the average error of the ensemble mean  $e_{EM}$ :

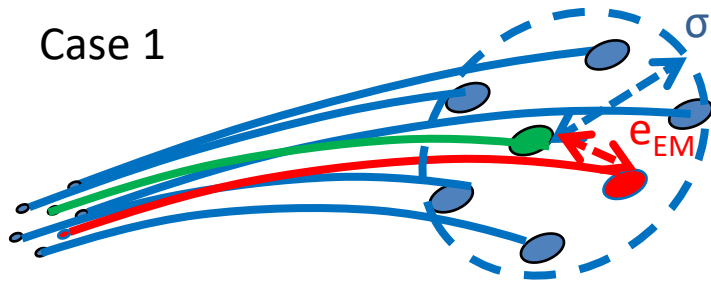
$$\langle \sigma \rangle_M = \langle e_{EM} \rangle_M$$

# In a reliable ensemble, $\langle \text{fc-prob} \rangle \sim \langle \text{obs-prob} \rangle$

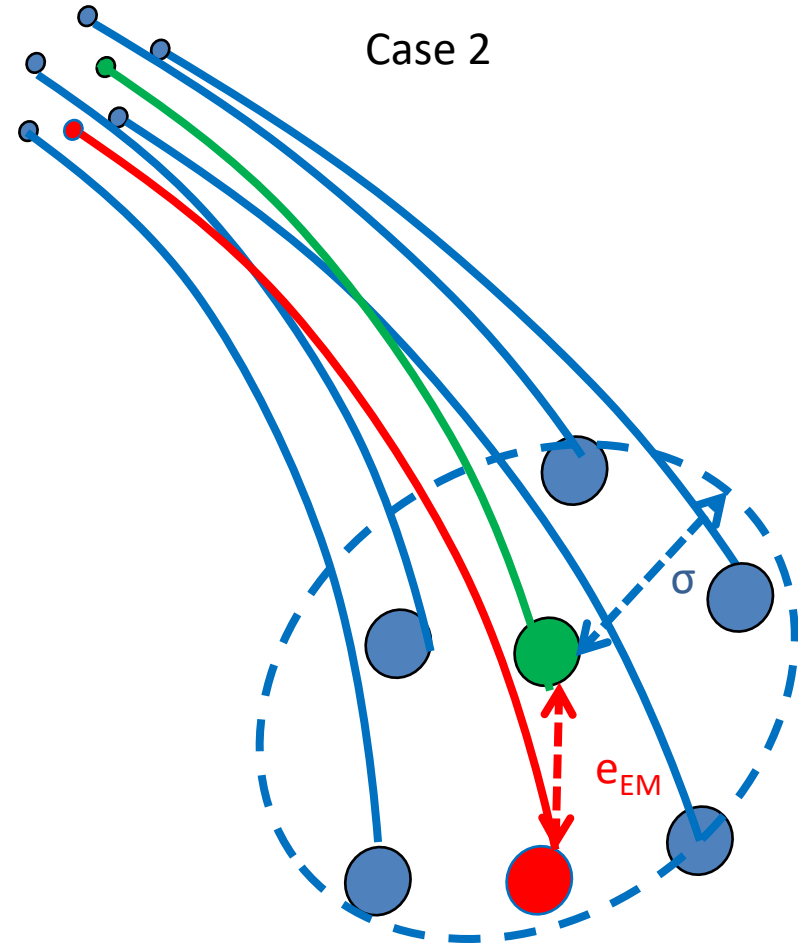
One way to check the ensemble reliability is to assess whether the average forecast and observed probabilities of a certain event are similar.

These plots compare the two probabilities at t+144h and t+240h for the event '24h precipitation in excess of 1/5/10/20 mm' over Europe for ND14J15 (verified against observations).





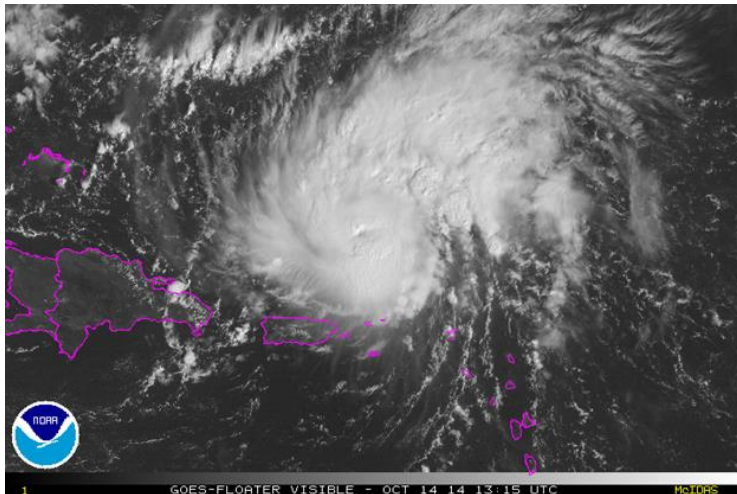
In a reliable ensemble, small ensemble standard deviation indicates a more predictable case, i.e. a small error of the ensemble mean  $e_{EM}$ .





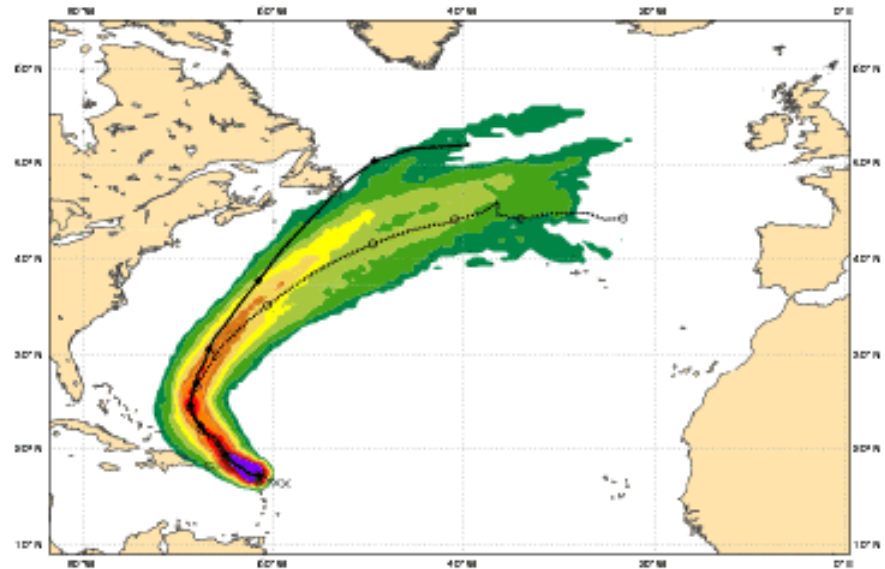
# Track dispersion & predictability: Gonzalo (Oct 2014)

Gonzalo (Oct 2014) - Dispersion of ENS tracks in the 10d forecast issued on 2014.10.13@12 was relatively small for the whole 10 day range, indicating more confidence on direction of travel.



Date 20141013 12 UTC @ECMWF  
 Probability that **GONZALO** will pass within 120 km radius during the next 240 hours  
 tracks: **solid**=HRES; **dot**=Ens Mean [reported minimum central pressure (hPa) **992** ]

■ 0-10 ■ 10-20 ■ 20-30 ■ 30-40 ■ 40-50 ■ 50-60 ■ 60-70 ■ 70-80 ■ 80-90 ■ >90%



List of ensemble members numbers to recast Tropical Cyclone  
 Intensity category in colours: **TD**[up to 33] **TS**[34-63] **HR1**[64-82] **HR2**[83-95] **HR3**[>95] [k]

+000 h:	04	05	06	07	08	09	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35	36	37	38	39	40	41	42	43	44	45	46	47	48	49	50	51	52	53	54	55	56	57	58	59	60	61	62	63	64	65	66	67	68	69	70	71	72	73	74	75	76	77	78	79	80	81	82	83	84	85	86	87	88	89	90	91	92	93	94	95	96	97	98	99
+040 h:	04	05	06	07	08	09	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35	36	37	38	39	40	41	42	43	44	45	46	47	48	49	50	51	52	53	54	55	56	57	58	59	60	61	62	63	64	65	66	67	68	69	70	71	72	73	74	75	76	77	78	79	80	81	82	83	84	85	86	87	88	89	90	91	92	93	94	95	96	97	98	99
+080 h:	04	05	06	07	08	09	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35	36	37	38	39	40	41	42	43	44	45	46	47	48	49	50	51	52	53	54	55	56	57	58	59	60	61	62	63	64	65	66	67	68	69	70	71	72	73	74	75	76	77	78	79	80	81	82	83	84	85	86	87	88	89	90	91	92	93	94	95	96	97	98	99
+120 h:	04	05	06	07	08	09	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35	36	37	38	39	40	41	42	43	44	45	46	47	48	49	50	51	52	53	54	55	56	57	58	59	60	61	62	63	64	65	66	67	68	69	70	71	72	73	74	75	76	77	78	79	80	81	82	83	84	85	86	87	88	89	90	91	92	93	94	95	96	97	98	99
+160 h:	04	05	06	07	08	09	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35	36	37	38	39	40	41	42	43	44	45	46	47	48	49	50	51	52	53	54	55	56	57	58	59	60	61	62	63	64	65	66	67	68	69	70	71	72	73	74	75	76	77	78	79	80	81	82	83	84	85	86	87	88	89	90	91	92	93	94	95	96	97	98	99
+200 h:	04	05	06	07	08	09	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35	36	37	38	39	40	41	42	43	44	45	46	47	48	49	50	51	52	53	54	55	56	57	58	59	60	61	62	63	64	65	66	67	68	69	70	71	72	73	74	75	76	77	78	79	80	81	82	83	84	85	86	87	88	89	90	91	92	93	94	95	96	97	98	99
+240 h:	04	05	06	07	08	09	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35	36	37	38	39	40	41	42	43	44	45	46	47	48	49	50	51	52	53	54	55	56	57	58	59	60	61	62	63	64	65	66	67	68	69	70	71	72	73	74	75	76	77	78	79	80	81	82	83	84	85	86	87	88	89	90	91	92	93	94	95	96	97	98	99

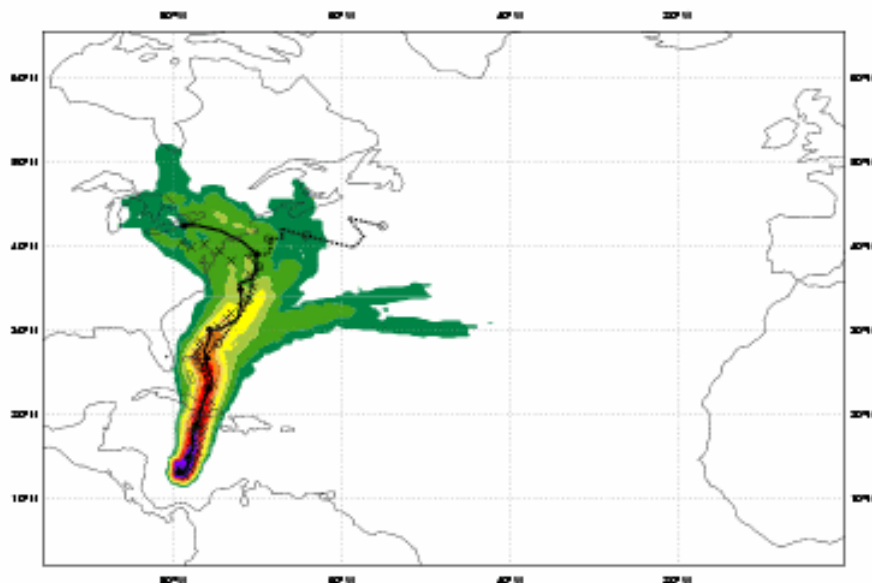
# Example: Track dispersion & predictability: Sandy (Oct 2012)

Sandy (Oct 2012) - Dispersion of ENS tracks in the 10d forecast issued on 2012.10.23@00 was relatively large after forecast day 5, indicating high uncertainty on direction and landfall location.



Date 20121023 00 UTC @ECMWF  
 Probability that SANDY will pass within 120 km radius during the next 240 hours  
 tracks: solid-OPER; dot-Ens Mean [reported minimum central pressure (hPa) 998 ]

■ 0-10 ■ 10-20 ■ 20-30 ■ 30-40 ■ 40-50 ■ 50-60 ■ 60-70 ■ 70-80 ■ 80-90 ■ 90-100



List of ensemble members numbers forecast Tropical Cyclone  
 Intensity category in colours: TD [up to 33] TS [34-63] HR1 [64-82] HR2 [83-95] HR3 [ >95 H]

+02 h	01	02	03	04	05	06	07	08	09	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35	36	37	38	39	40	41	42	43	44	45	46	47	48	49	50	51	52	53	54	55	56	57	58	59	60	61	62	63	64	65	66	67	68	69	70	71	72	73	74	75	76	77	78	79	80	81	82	83	84	85	86	87	88	89	90	91	92	93	94	95	96	97	98	99	100
+02 h	01	02	03	04	05	06	07	08	09	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35	36	37	38	39	40	41	42	43	44	45	46	47	48	49	50	51	52	53	54	55	56	57	58	59	60	61	62	63	64	65	66	67	68	69	70	71	72	73	74	75	76	77	78	79	80	81	82	83	84	85	86	87	88	89	90	91	92	93	94	95	96	97	98	99	100
+08 h	01	02	03	04	05	06	07	08	09	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35	36	37	38	39	40	41	42	43	44	45	46	47	48	49	50	51	52	53	54	55	56	57	58	59	60	61	62	63	64	65	66	67	68	69	70	71	72	73	74	75	76	77	78	79	80	81	82	83	84	85	86	87	88	89	90	91	92	93	94	95	96	97	98	99	100
+120 h	01	02	03	04	05	06	07	08	09	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35	36	37	38	39	40	41	42	43	44	45	46	47	48	49	50	51	52	53	54	55	56	57	58	59	60	61	62	63	64	65	66	67	68	69	70	71	72	73	74	75	76	77	78	79	80	81	82	83	84	85	86	87	88	89	90	91	92	93	94	95	96	97	98	99	100
+144 h	01	02	03	04	05	06	07	08	09	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35	36	37	38	39	40	41	42	43	44	45	46	47	48	49	50	51	52	53	54	55	56	57	58	59	60	61	62	63	64	65	66	67	68	69	70	71	72	73	74	75	76	77	78	79	80	81	82	83	84	85	86	87	88	89	90	91	92	93	94	95	96	97	98	99	100
+180 h	01	02	03	04	05	06	07	08	09	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35	36	37	38	39	40	41	42	43	44	45	46	47	48	49	50	51	52	53	54	55	56	57	58	59	60	61	62	63	64	65	66	67	68	69	70	71	72	73	74	75	76	77	78	79	80	81	82	83	84	85	86	87	88	89	90	91	92	93	94	95	96	97	98	99	100
+216 h	01	02	03	04	05	06	07	08	09	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35	36	37	38	39	40	41	42	43	44	45	46	47	48	49	50	51	52	53	54	55	56	57	58	59	60	61	62	63	64	65	66	67	68	69	70	71	72	73	74	75	76	77	78	79	80	81	82	83	84	85	86	87	88	89	90	91	92	93	94	95	96	97	98	99	100
+288 h	01	02	03	04	05	06	07	08	09	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35	36	37	38	39	40	41	42	43	44	45	46	47	48	49	50	51	52	53	54	55	56	57	58	59	60	61	62	63	64	65	66	67	68	69	70	71	72	73	74	75	76	77	78	79	80	81	82	83	84	85	86	87	88	89	90	91	92	93	94	95	96	97	98	99	100
+360 h	01	02	03	04	05	06	07	08	09	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35	36	37	38	39	40	41	42	43	44	45	46	47	48	49	50	51	52	53	54	55	56	57	58	59	60	61	62	63	64	65	66	67	68	69	70	71	72	73	74	75	76	77	78	79	80	81	82	83	84	85	86	87	88	89	90	91	92	93	94	95	96	97	98	99	100

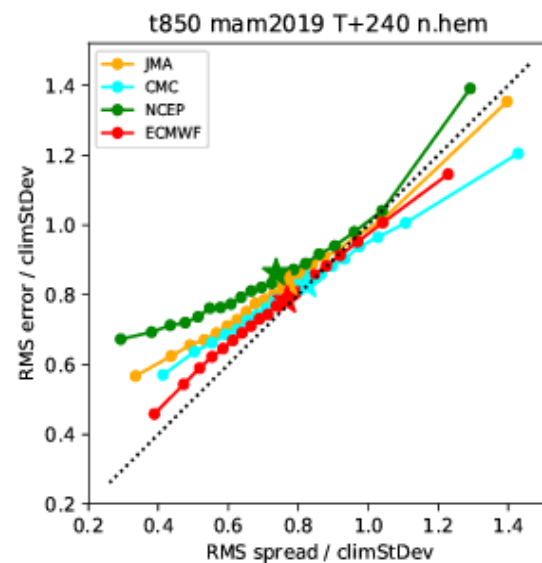
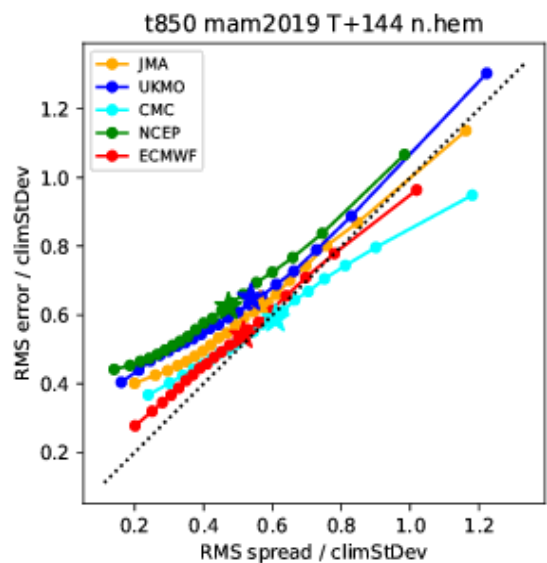
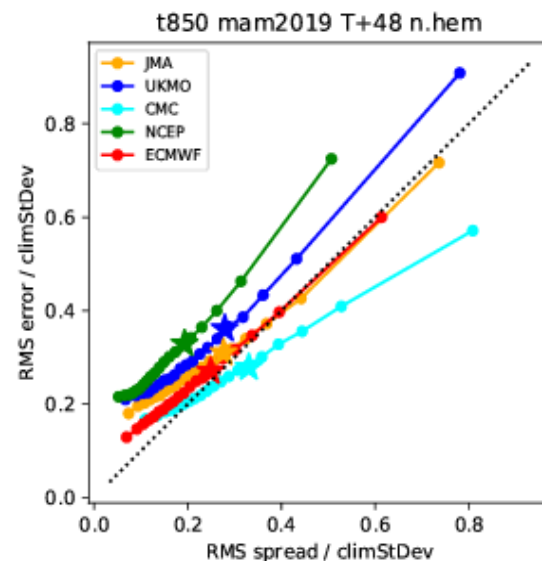
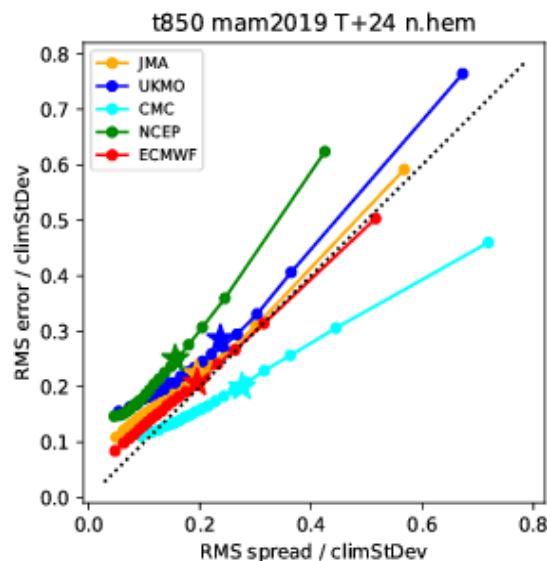


# ENS spread as an index of predictability

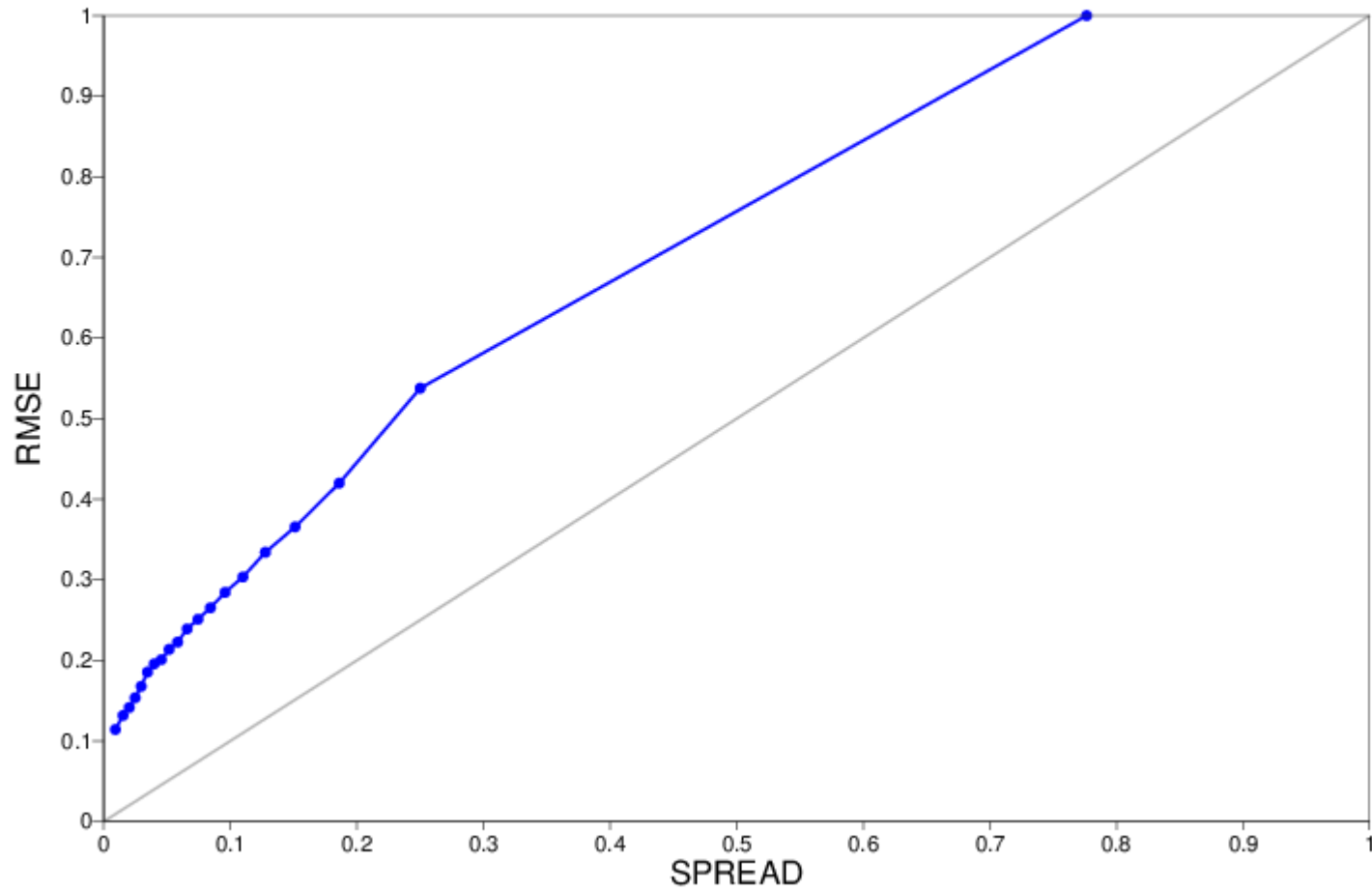
Small ensemble spread should identify predictable conditions

Generally true for short and medium range ensemble forecasts

Is it true for S2S time range?



## SST Spread/skill relationship for SST forecasts at week 4





# How do we produce ensembles?

# What should an ensemble prediction simulate?

Two schools of thought:

- ❖ Monte Carlo approach: sample all sources of forecast error, perturb any input variable and any model parameter that is not perfectly known. Take into consideration as many sources as possible of forecast error.
- ❖ Reduced sampling: sample leading sources of forecast error, prioritize. Rank sources, prioritize, optimize sampling: growing components will dominate forecast error growth.

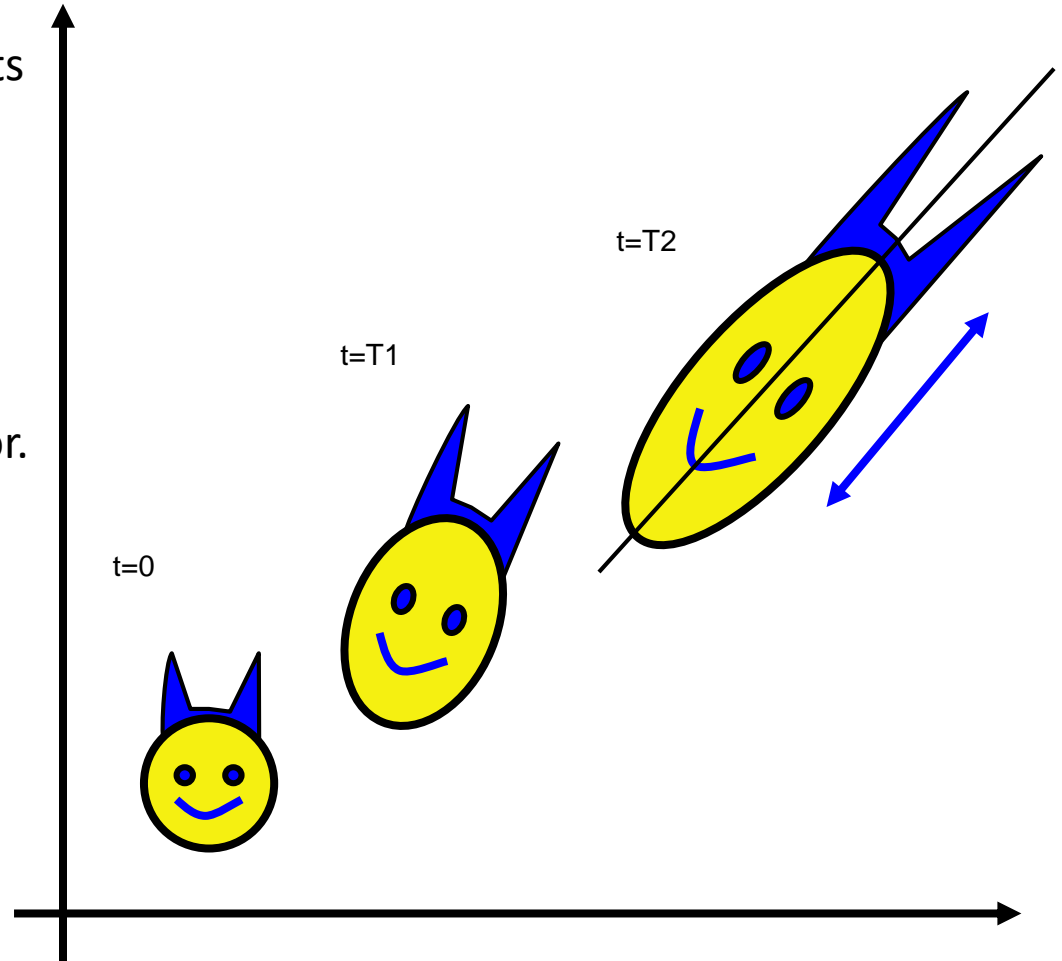
*There is a strong constraint: limited resources  
(man and computer power)!*



# How should initial uncertainties be defined?

The initial perturbations' components pointing along the directions of maximum growth amplify most.

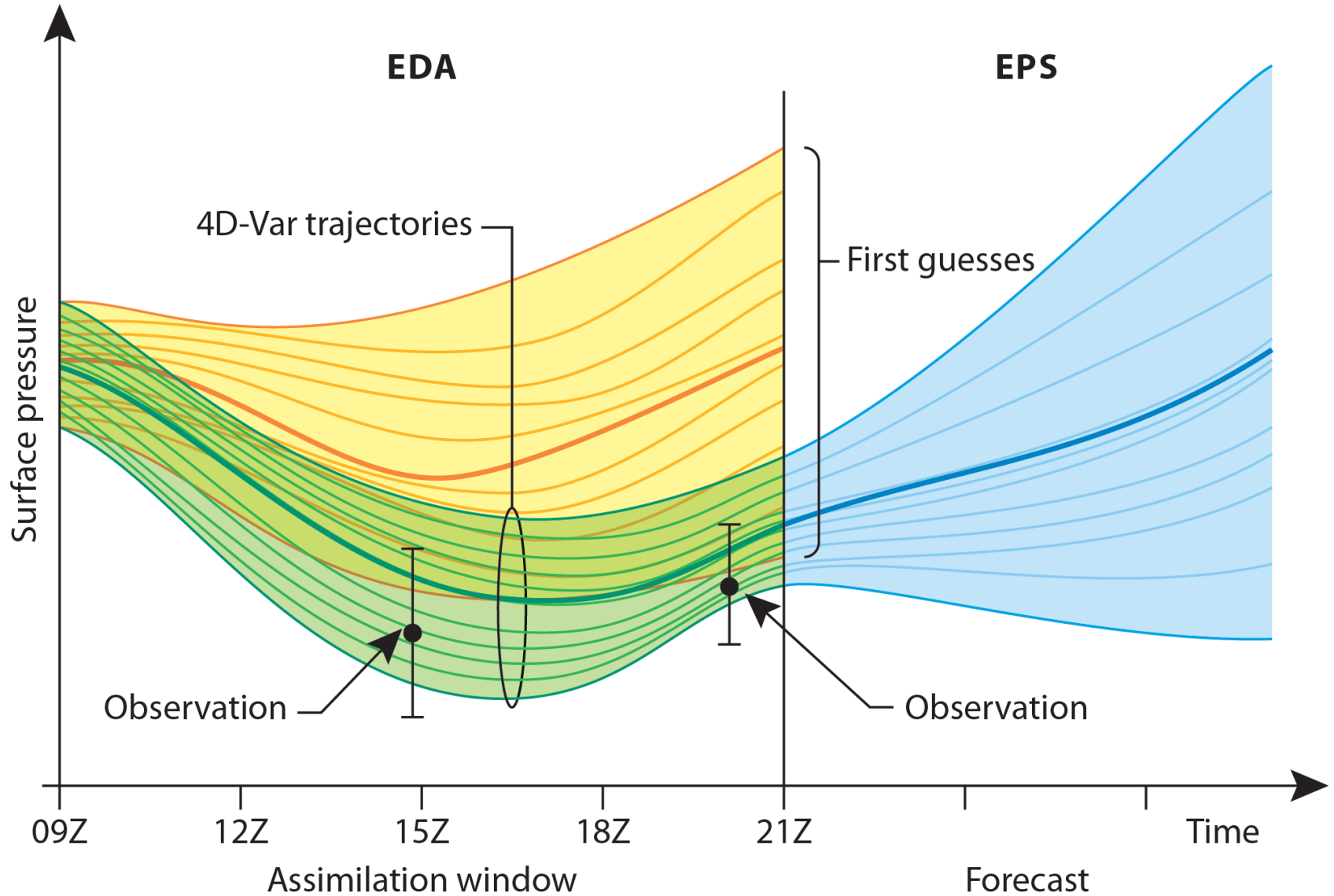
If we knew the directions of maximum growth we could estimate the potential maximum forecast error.



# Current methods for perturbing initial conditions

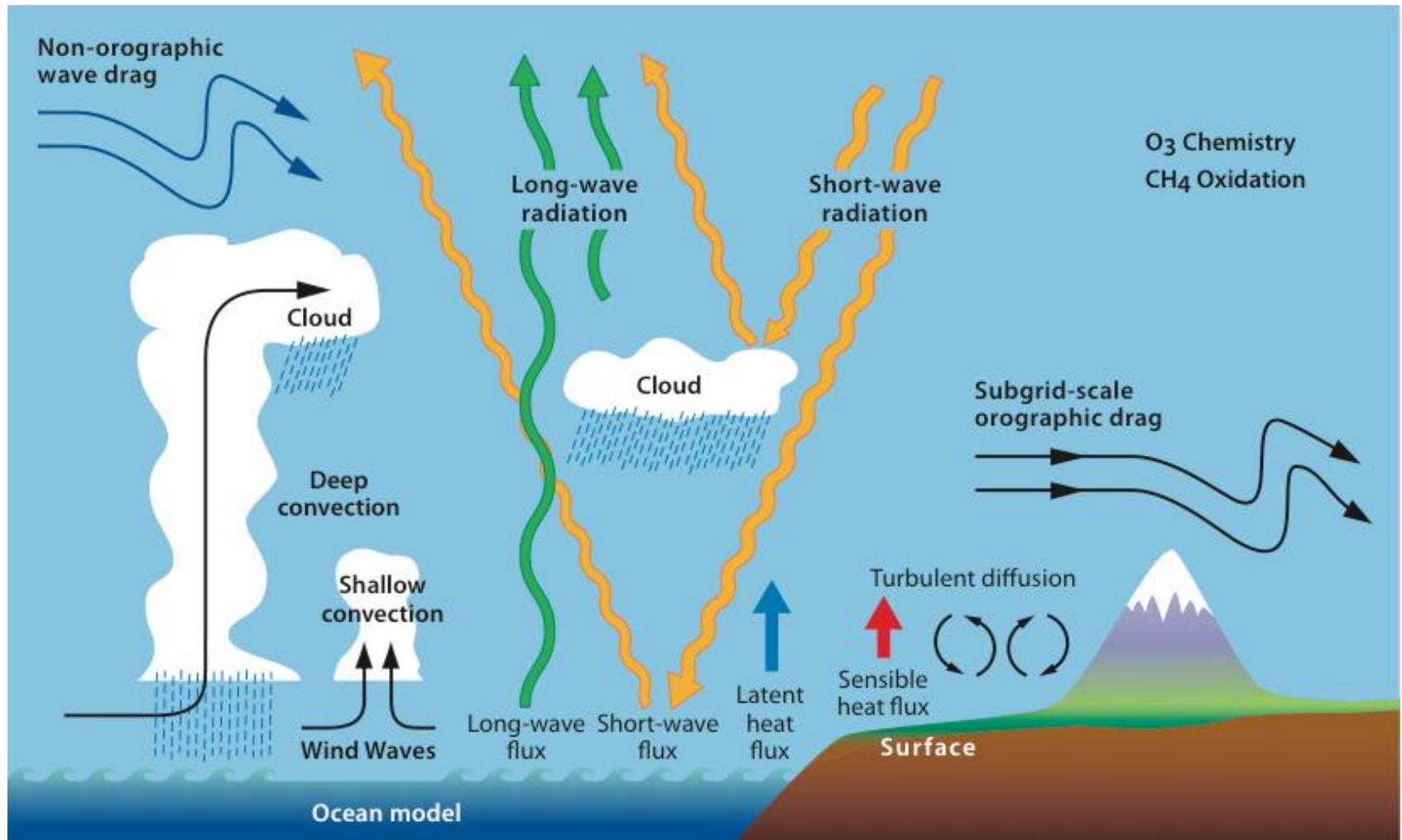
1. Lag ensemble: each ensemble member starts from a different analysis produced at a different time (e.g. 6 hour apart).
2. Singular vectors (e.g ECMWF) or breeding vectors (NCEP)
3. Ensemble of data assimilations (slightly different analyses). E.g. 51 member EDA at ECMWF
4. Combination of 1, 2 or 3. For example at ECMWF, combination of 1 and 3.

# Ensemble assimilation and prediction



# Model error: where does it come from?

## Processes represented in the model:

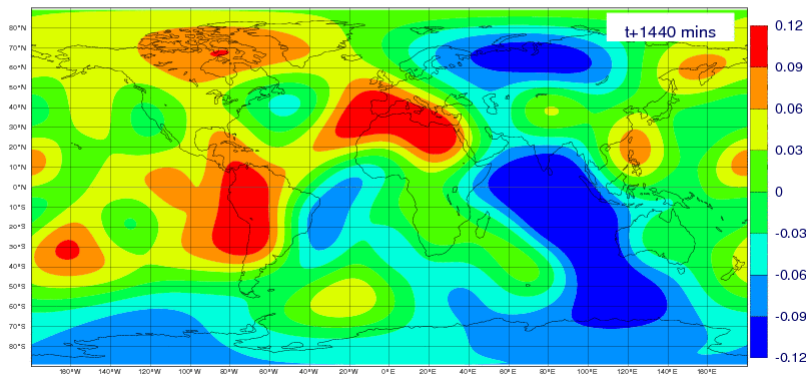
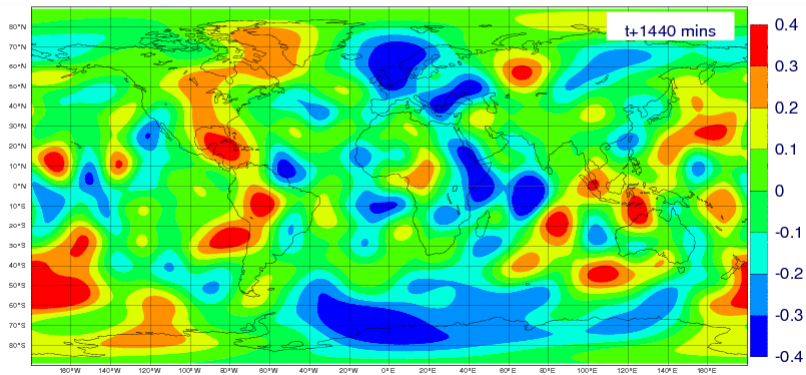
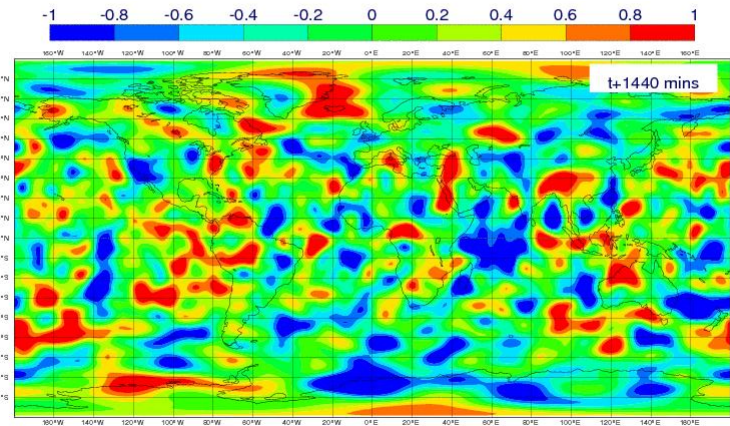
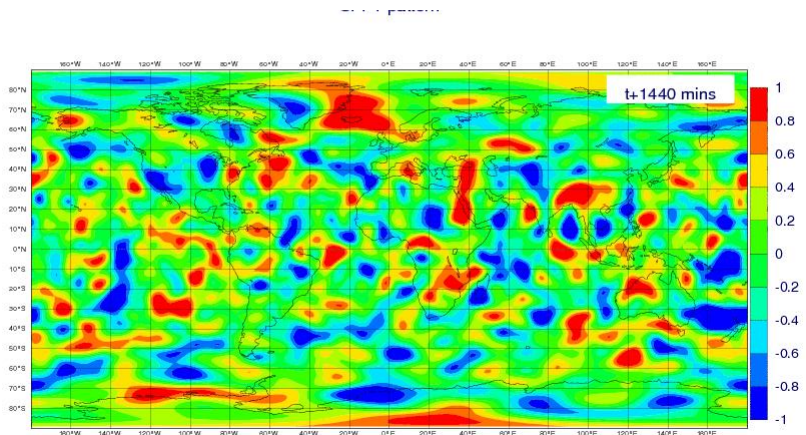




### How can we represent model errors?

- Multi-model ensembles
- Multi-physics ensembles
- Perturbed parameter ensembles
- “Stochastic parameterizations”

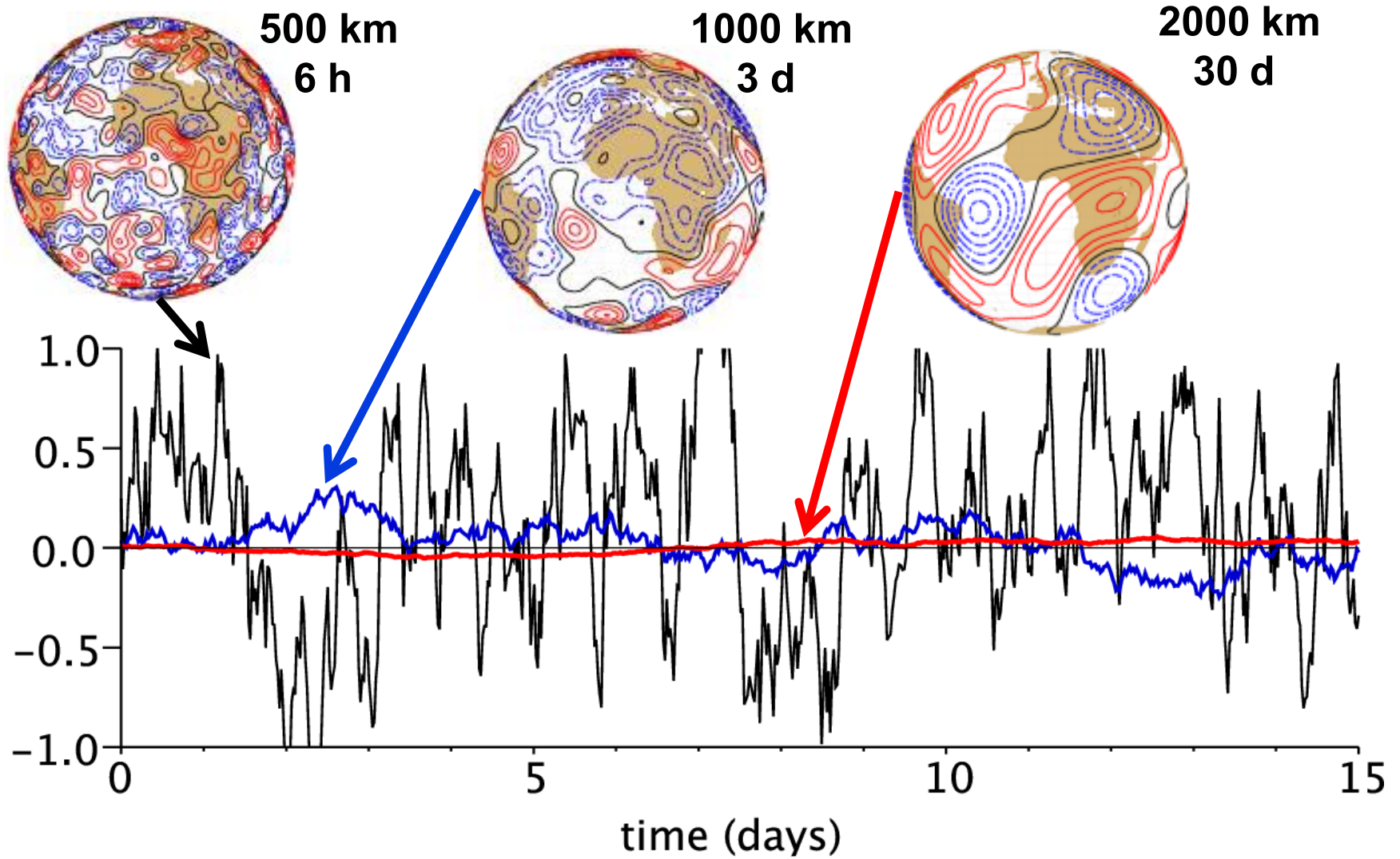
# SPPT pattern



3 correlation scales:

i)	6 hours,	500 km,	$\sigma = 0.52$
ii)	3 days,	1 000 km,	$\sigma = 0.18$
iii)	30 days,	2 000 km,	$\sigma = 0.06$

# SPPT pattern





# Ensembles in the S2S database

# S2S Models

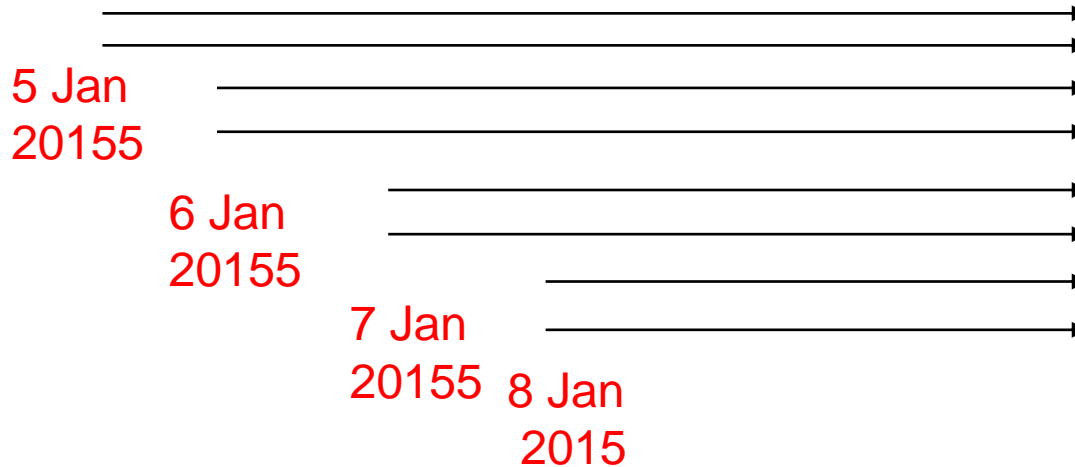
	Time-range	Resol.	Ens. Size	Freq.	Hcsts	Hcst length	Hcst Freq	Hcst Size
<b>ECMWF</b>	D 0-32	T639/316L91	51	2/week	On the fly	Past 20y	2/weekly	11
<b>UKMO</b>	D 0-60	N216L85	4	daily	On the fly	1989-2003	4/month	3
<b>NCEP</b>	D 0-44	N126L64	4	4/daily	Fix	1999-2010	4/daily	1
<b>EC</b>	D 0-35	0.6x0.6L40	21	weekly	On the fly	Past 15y	weekly	4
<b>CAWCR</b>	D 0-60	T47L17	33	weekly	Fix	1981-2013	6/month	33
<b>JMA</b>	D 0-34	T159L60	50	weekly	Fix	1979-2009	3/month	5
<b>KMA</b>	D 0-60	N216L85	4	daily	On the fly	1996-2009	4/month	3
<b>CMA</b>	D 0-45	T106L40	4	daily	Fix	1992-now	daily	4
<b>Met.Fr</b>	D 0-60	T117L31	51	monthly	Fix	1981-2005	monthly	11
<b>CNR</b>	D 0-32	0.75x0.56 L54	40	weekly	Fix	1981-2010	6/month	1
<b>HMCR</b>	D 0-63	1.1x1.4 L28	20	weekly	Fix	1981-2010	weekly	10

# Burst ensemble vs lag approach

Burst approach: 1 start date, large ensemble size



Lag ensemble approach: multiple start date, small ensemble size



# Burst ensemble vs lag approach

## **Burst approach:**

Advantage: Uses Freshest initial conditions  
More control on the ensemble generation

Disadvantage: Too costly to run daily  
“flip-flop” forecasts

## **Lag approach:**

Advantage: Forecasts can be updates every day  
Smooth evolution of the forecasts

Disadvantage: less skilful because it uses “old” initial conditions

# Conclusions

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- Ensemble generation includes perturbations in the initial conditions + perturbations in the model physics.
- Various strategies for ensemble generation: burst vs lag ensemble. Not clear which one is optimal for S2S.