

# DEVELOPMENT OF THE ECMWF FORECASTING SYSTEM

Jean-Noël Thépaut

European Centre for Medium Range Weather Forecasts  
ECMWF

**Acknowledgements: Lars Isaksen, Mike Fisher, Yannick Trémolet, Peter Bauer, Adrian Simmons, Martin Miller, Sakari Uppala, and many other colleagues from the Research and Operational Departments**

# Outline

- **Components of the ECMWF forecasting system**
- **Performance of the NWP system**
- **Other applications**
- **Future evolutions and challenges**

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# The operational forecasting system

- **Data assimilation:** twice per day  
12-hour (6-hour) 4D-Var 25 km 91-level; 210/125/80 km minimisations
- **High resolution deterministic forecast:** twice per day  
25 km 91-level, to 10 days ahead
- **Ensemble forecast (EPS):** twice daily  
51 members, 62-level, 50 km to 10 days, then 80 km to 15 days
- **Ocean waves:** twice daily  
Global: 10 days ahead at 40 km; EPS 15 days ahead at 100 km  
European Waters: 5 days ahead at 25 km
- **Monthly forecast:** once a week (coupled to ocean model)  
51-members, 50/80 km 62 levels, to one month ahead
- **Seasonal forecast:** once a month (coupled to ocean model)  
41 members, 125 km 62 levels, to seven months ahead
- **Boundary Conditions:** short cut-off analyses based on 6-hourly 4D-Var initiating a forecast to 3 days, four times per day

## Breakdown of core operational computer usage

	<b>1994</b>	<b>2008</b>
<b>24h data assimilation</b>	<b>20%</b>	<b>37%</b>
<b>10-day deterministic forecast</b>	<b>40%</b>	<b>18%</b>
<b>Ensemble forecasts</b>	<b>40%</b>	<b>45%</b>

**The issues of computer performance and scalability of the ECMWF NWP system will be addressed by Deborah Salmond and Mats Hamrud**

Over the last two/three years, forecasting system developments have included

- **T799/L91 higher-resolution forecast system.**
- **Variable-resolution ensemble prediction system (VAREPS) to 15 days.**
- **Significant improvements of model physics.**
- **New satellite data assimilated:**
  - **METOP-A instruments,**
  - **MTSAT AMVs + COSMIC GPS radio occultation,**
  - **More microwave radiances (AMSR-E, TMI and SSMIS),**
  - **More SBUV ozone retrievals and monitoring of OMI (AURA).**
- **New moist linear physics in 4D-Var, and 3<sup>rd</sup> outer loop: now minimizing at T95 → T159 → T255.**
- **Better treatment of satellite data in the presence of rain and clouds**

# Observation data count for one 12h 4D-Var cycle 0900-2100UTC 3 March 2008

## Screened

## Assimilated

● Synop:	450,000	0.3%	● Synop:	64,000	0.7%
● Aircraft:	434,000	0.3%	● Aircraft:	215,000	2.4%
● Dribu:	24,000	0.02%	● Dribu:	7,000	0.1%
● Temp:	153,000	0.1%	● Temp:	76,000	0.8%
● Pilot:	86,000	0.1%	● Pilot:	39,000	0.4%
● AMV's:	2,535,000	1.6%	● AMV's:	125,000	1.4%
● Radiance data:	150,663,000	96.9%	● Radiance data:	8,207,000	91.0%
● Scat:	835,000	0.5%	● Scat:	149,000	1.7%
● GPS radio occult.	271,000	0.2%	● GPS radio occult.	137,000	1.5%
<b>TOTAL:</b>	<b>155,448,000</b>	<b>100.00%</b>	<b>TOTAL:</b>	<b>9,018,000</b>	<b>100.00%</b>

99% of screened data is from satellites

96% of assimilated data is from satellites

# Outline

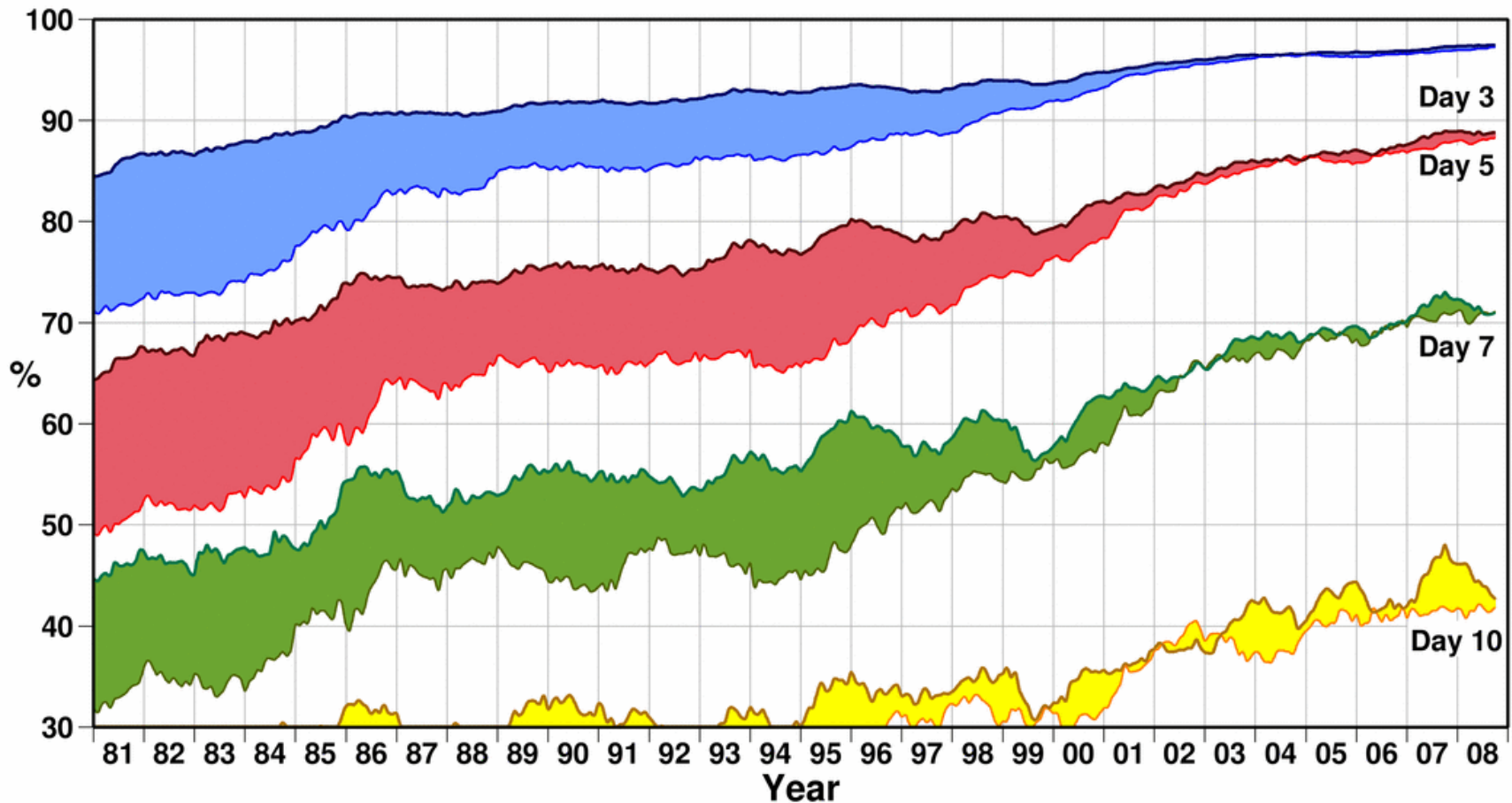
- Components of the ECMWF forecasting system
- **Performance of the NWP system**
- Other applications
- Future evolutions and challenges



# Improvement of ECMWF forecasts

## Anomaly correlation of 500hPa height forecasts

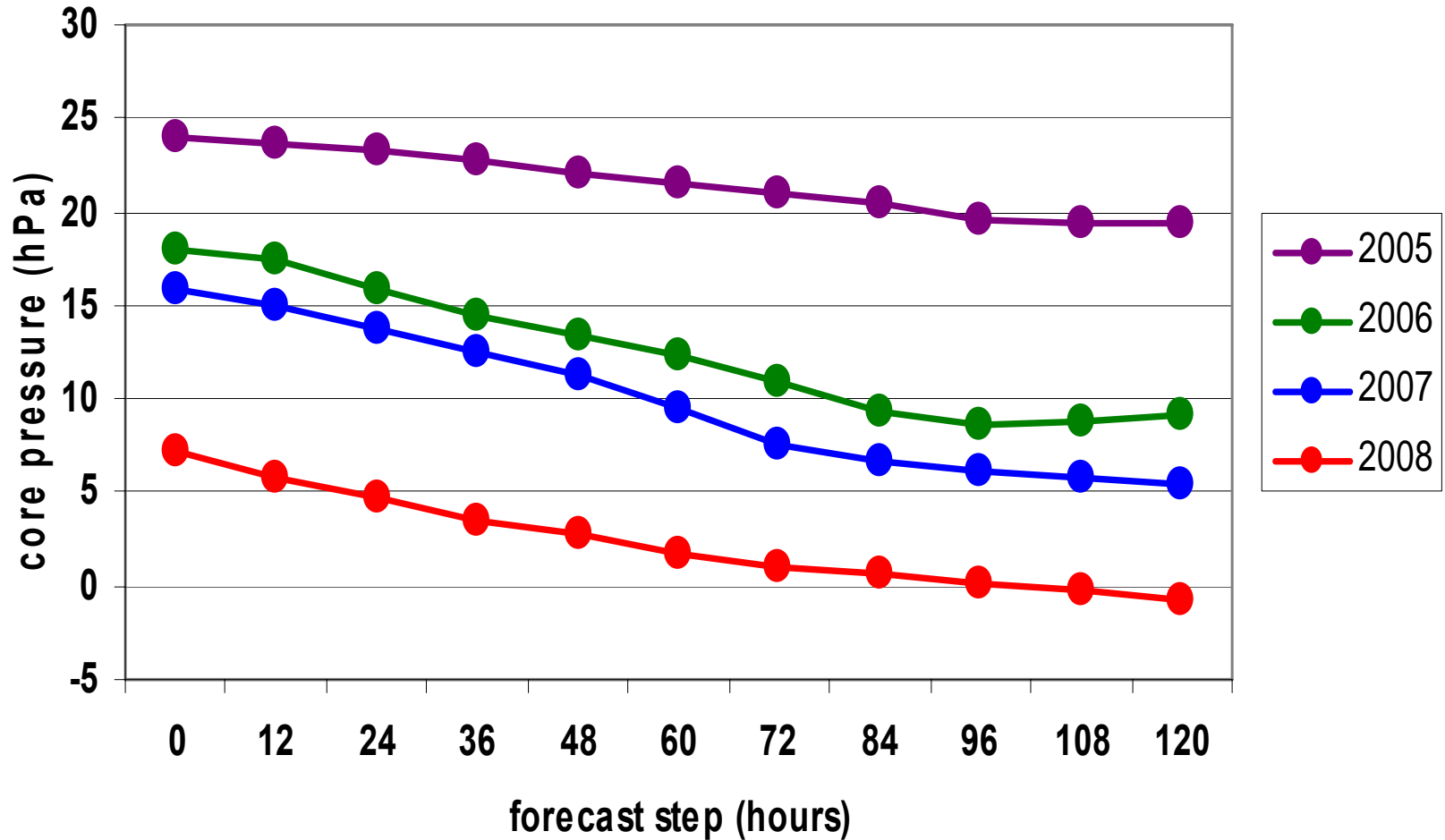
— Northern hemisphere      — Southern hemisphere



# Tropical Cyclone Intensity Error

(mean of 365 days ending at 15 August)

ECMWF

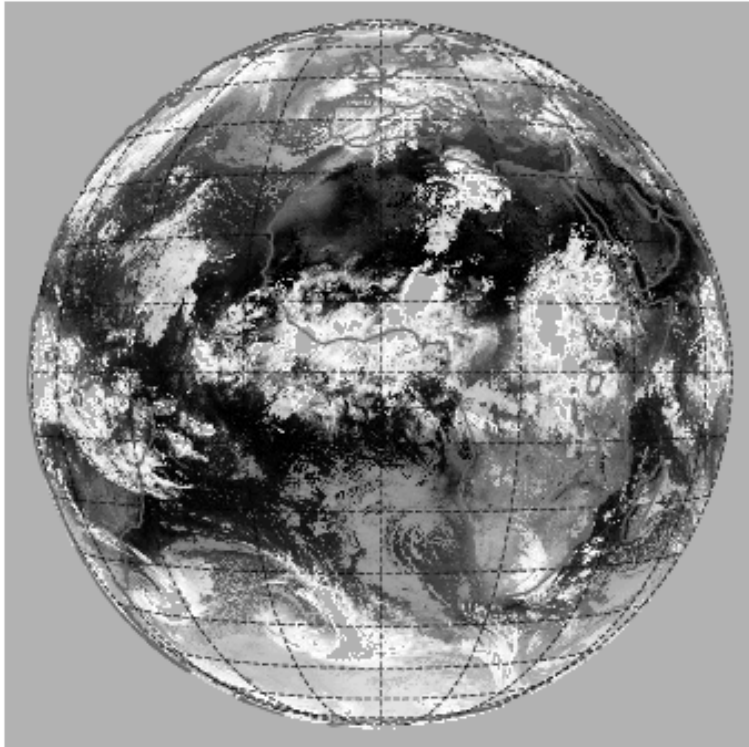


# Simulated Meteosat imagery

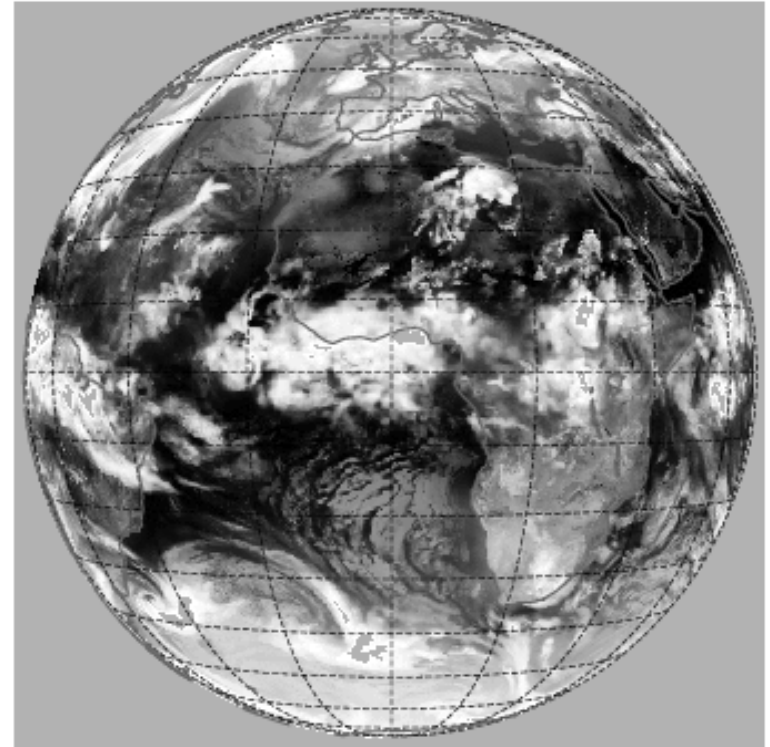
T799 36h forecast from 20080525

(Bechtold 2008)

**Meteosat 9 IR10.8 20080525 0 UTC**



**RTTOV gen. Meteosat 8 IR10.8 ECMWF Fc 20080525 00 UTC:**



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# Other applications: reanalyses

To improve the understanding of

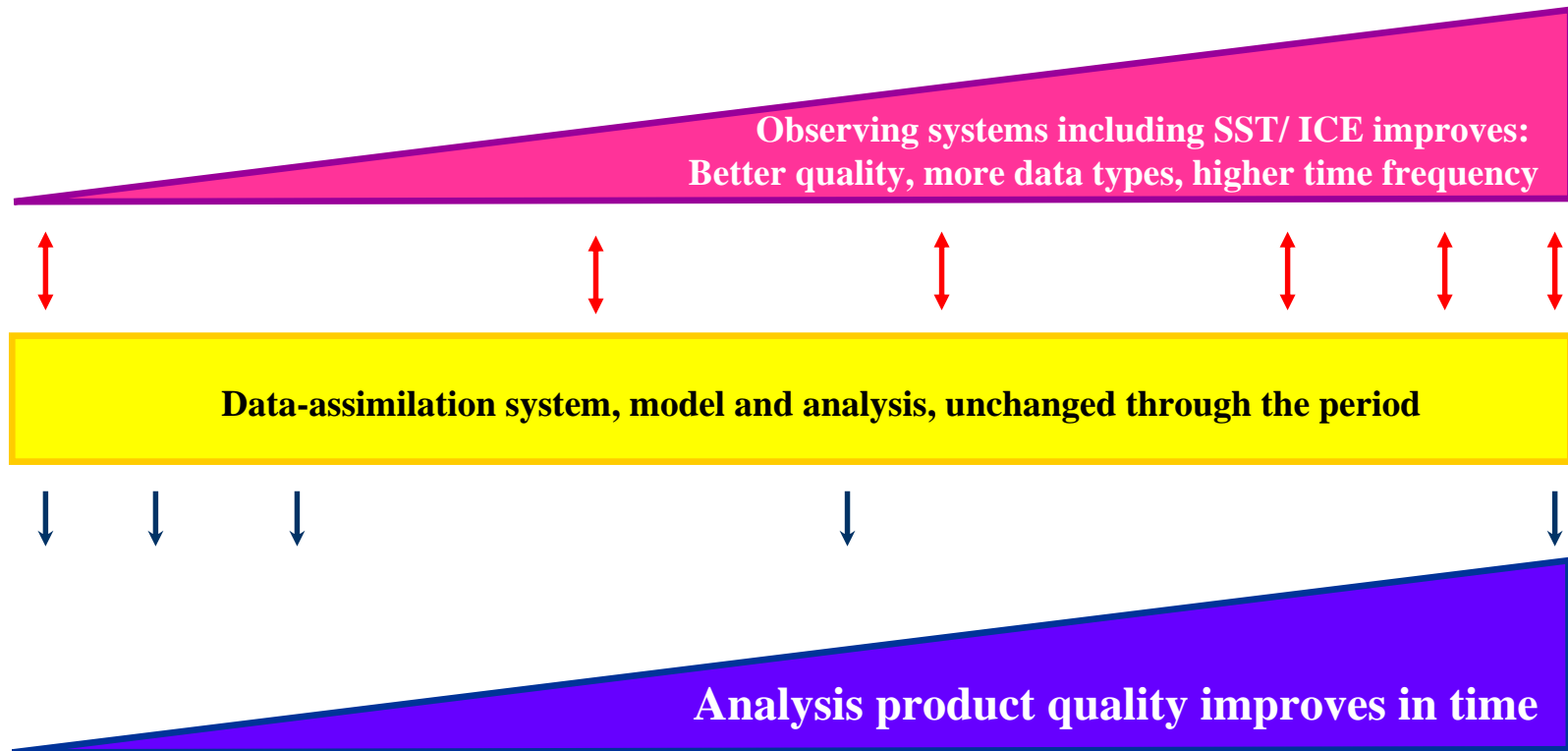
- Weather, climate and general circulation of atmosphere
- Predictability from daily to seasonal, long term variability and climate trends
- Tele-connections
- Atmospheric transport
- Hydrological cycle and surface processes
- Extreme weather, storm tracking, tropical cyclones, ...

To provide initial states, external forcing or validation data for

- Climate model integrations
- Ocean models
- Monthly and seasonal forecasting
- Chemical transport models
- ...

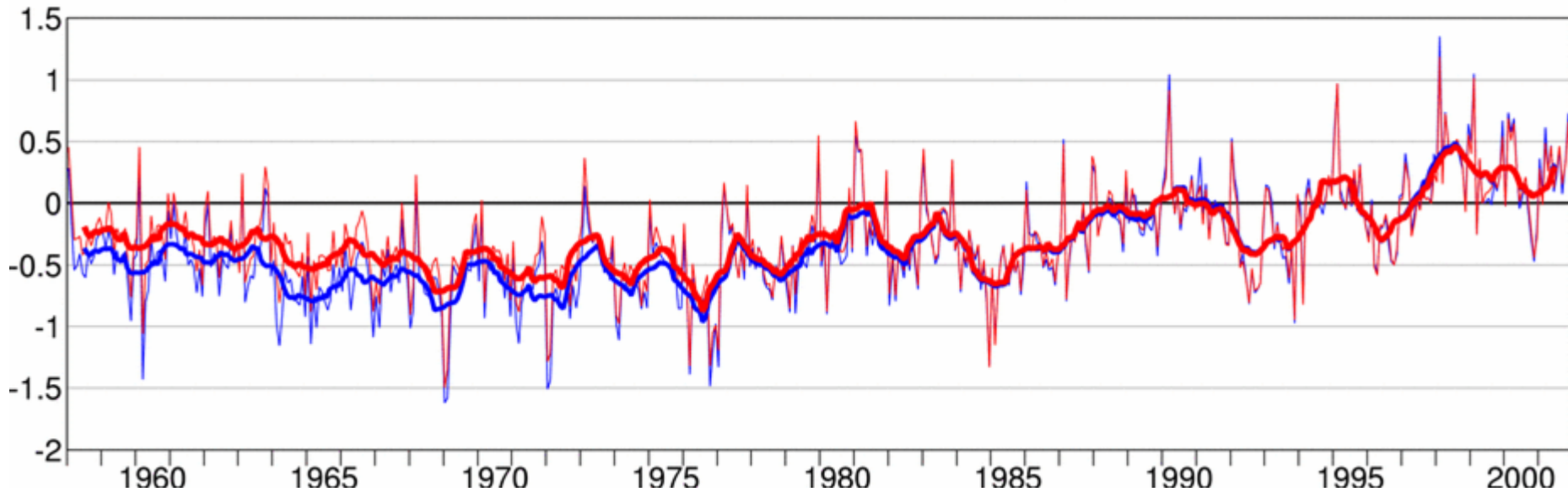
A substitute for “observed statistics”? An ideal tool to produce and monitor Essential Climate Variables?

# Reanalysis schematically



# Trend and variability in two-metre temperature

Average over all northern hemisphere CRU grid boxes



**CRUTEM2v (Jones and Moberg, 2003)**

**ERA-40**

Linear trend (1979-2001):	<b>CRUTEM2v</b>	<b>0.31°C/decade</b>
	<b>ERA-40</b>	<b>0.28°C/decade</b>
	<b>NCEP</b>	<b>0.19°C/decade</b>

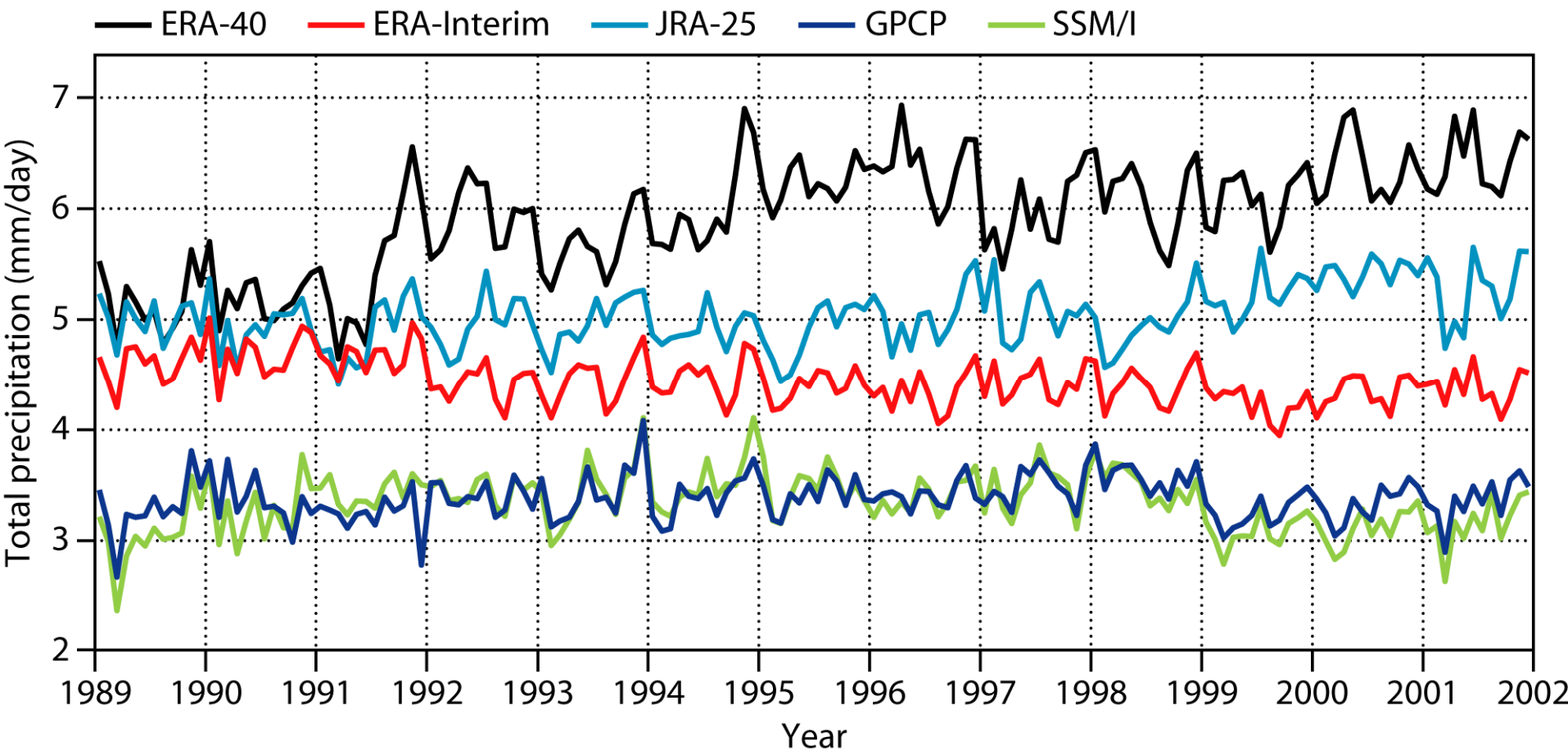
ERA-Interim 1989 → to continue as CDAS →

ERA-40 1957-2002

- **Data-assimilation system**
  - T159L60 → T255L60 / 12 hour 4D-Var**
  - New humidity analysis and improved model physics**
- **Satellite level-1c radiances**
  - Better RTTOV and improved use of radiances, especially IR and AMSU**
  - Assimilation of rain affected radiances through 1D-Var**
  - Variational bias correction**
- **Improved use of radiosondes**
  - Bias correction and homogenization based on ERA-40**
- **Correction of SHIP/ SYNOP surface pressure biases**
- **Use of reprocessed**
  - **Meteosat winds**
  - **GPS-RO data CHAMP / UCAR 2001 →, GRACE and COSMIC**
  - **GOME O3 profiles 1995 →**
- **New set of Altimeter wave height data 1991→**



# Tropical Ocean areas



- **Research & Development as a collaborative effort 2009-2011 (under FP7 and with a aimed production starting in 2012)**
- **1938 → 2015 and continue as CDAS**
- **Important components**
  - **Recovery, organization and homogenization of observations**
  - **Improved SST & ICE dataset**
  - **Variational analysis technique aimed for reanalysis**
  - **Comprehensive adaptive bias handling (including handling of model biases)**
  - **Research on coupled atmospheric-ocean-land reanalysis?**
  - **Better historical forcing data (aerosols, greenhouse gases,...)**

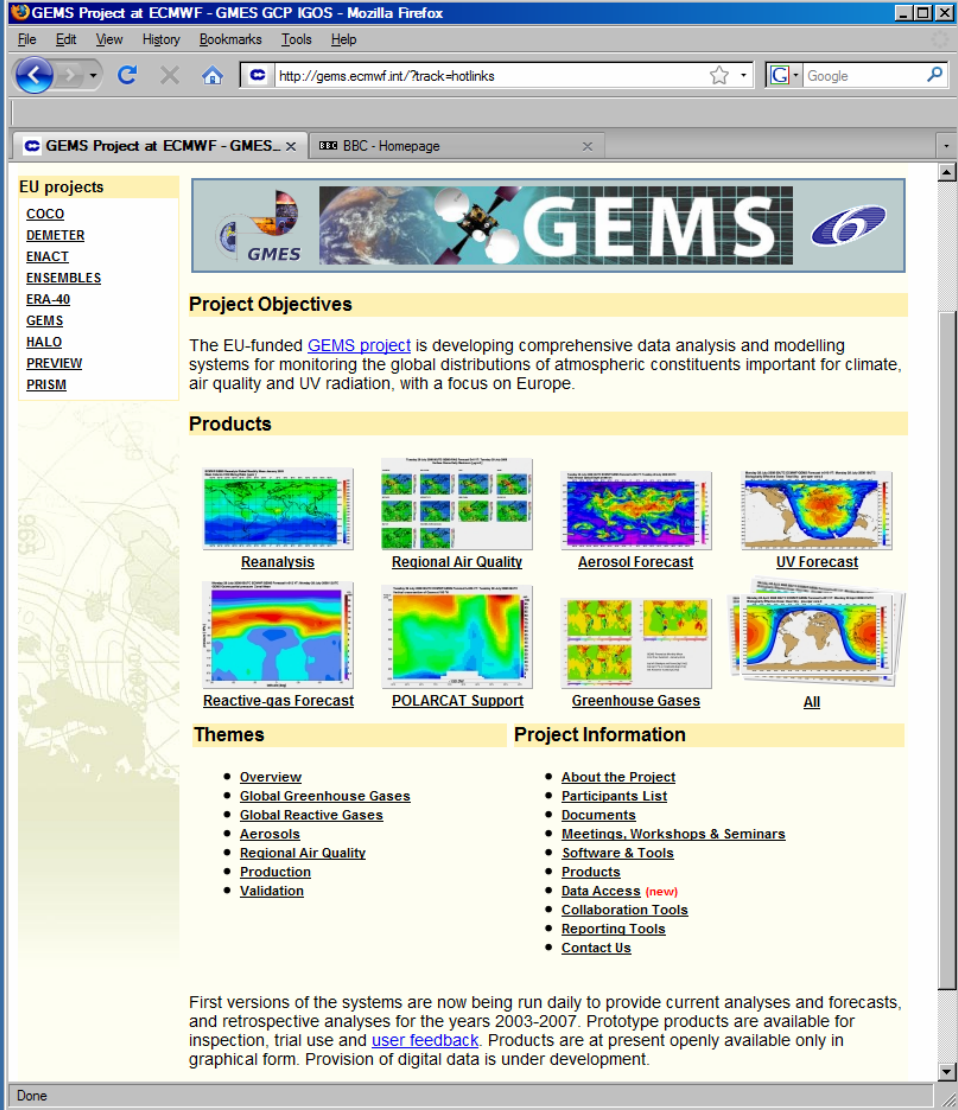
# Other applications: GEMS

Global and regional Earth-system Monitoring using Satellite and in-situ data

- An EC FP6 Integrated Project (2005-2009) that is developing:
  - **Global modelling and data assimilation for greenhouse gases, reactive gases and aerosols**
  - **An integrated production system for the above**
  - **Regional forecasting of reactive gases and aerosols**
  
- ECMWF is providing:
  - **Project coordination**
  - **Modelling and assimilation system for CO<sub>2</sub>, CH<sub>4</sub>, O<sub>3</sub>, CO, NO<sub>2</sub>, SO<sub>2</sub>, HCHO and aerosols**
  - **Analyses for ENVISAT/EOS period (2003-2007)**
  - **Support for regional air quality forecasting**

# Status of GEMS

- The system is running a near-real-time global system for reactive gases and aerosols
- A combined global reanalysis for 2003-2007 for greenhouse gases, reactive gases and aerosols has reached November 2005
- ECMWF is web-hosting coordinated regional air-quality forecasts from ten systems
- Plans are in place for the follow-on project MACC, with more formalised product delivery and user interaction



The screenshot shows the GEMS Project website in a Mozilla Firefox browser window. The page features a navigation menu on the left with links to EU projects: COCO, DEMETER, ENACT, ENSEMBLES, ERA-40, GEMS, HALO, PREVIEW, and PRISM. The main content area includes a header with the GEMS logo and a globe, followed by a 'Project Objectives' section describing the EU-funded project's goal of developing comprehensive data analysis and modelling systems. Below this is a 'Products' section displaying eight categories of data visualizations: Reanalysis, Regional Air Quality, Aerosol Forecast, UV Forecast, Reactive-gas Forecast, POLARCAT Support, Greenhouse Gases, and All. The 'Themes' and 'Project Information' sections provide further details and links. A footer note states that the first versions of the systems are now being run daily to provide current analyses and forecasts, and that prototype products are available for inspection, trial use, and user feedback.

**EU projects**

- COCO
- DEMETER
- ENACT
- ENSEMBLES
- ERA-40
- GEMS
- HALO
- PREVIEW
- PRISM

**Project Objectives**

The EU-funded [GEMS project](#) is developing comprehensive data analysis and modelling systems for monitoring the global distributions of atmospheric constituents important for climate, air quality and UV radiation, with a focus on Europe.

**Products**

- Reanalysis
- Regional Air Quality
- Aerosol Forecast
- UV Forecast
- Reactive-gas Forecast
- POLARCAT Support
- Greenhouse Gases
- All

**Themes**

- Overview
- Global Greenhouse Gases
- Global Reactive Gases
- Aerosols
- Regional Air Quality
- Production
- Validation

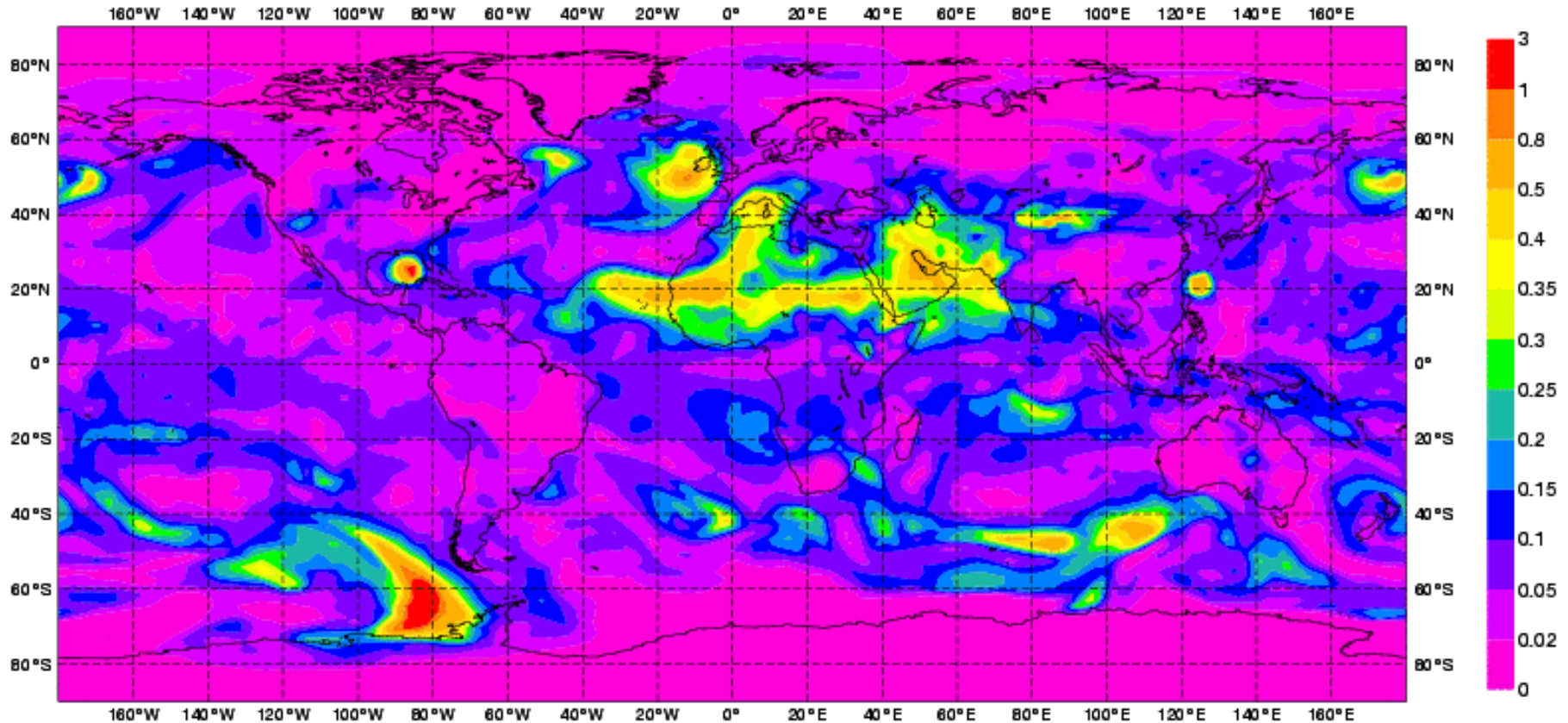
**Project Information**

- About the Project
- Participants List
- Documents
- Meetings, Workshops & Seminars
- Software & Tools
- Products
- Data Access (new)
- Collaboration Tools
- Reporting Tools
- Contact Us

First versions of the systems are now being run daily to provide current analyses and forecasts, and retrospective analyses for the years 2003-2007. Prototype products are available for inspection, trial use and [user feedback](#). Products are at present openly available only in graphical form. Provision of digital data is under development.

# Real-time forecasts (with assimilation of MODIS data)

Thursday 11 September 2008 00UTC ECMWF/GEMS Forecast t+003 VT: Thursday 11 September 2008 03UTC  
Sea-salt and Dust Aerosols Optical Depth at 550 nm



<http://gems.ecmwf.int>

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# Future evolutions and challenges

- **Model resolution increase**
- **Increased use of satellite data**
- **Long window (weak-constraint) 4D-Var**
- **Ensemble data assimilation**
- **Modularisation of the IFS**
- **Non hydrostatic modelling, better physics, etc...**

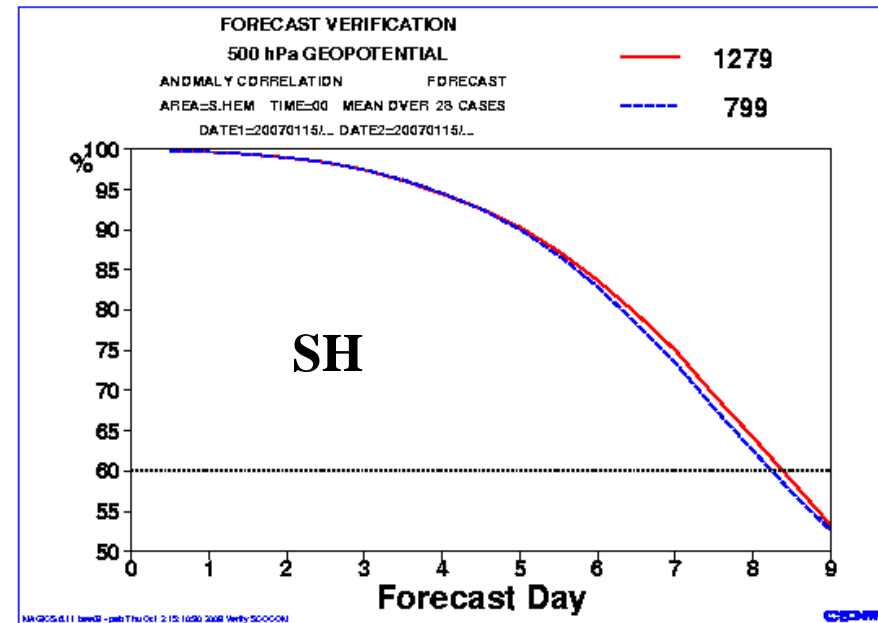
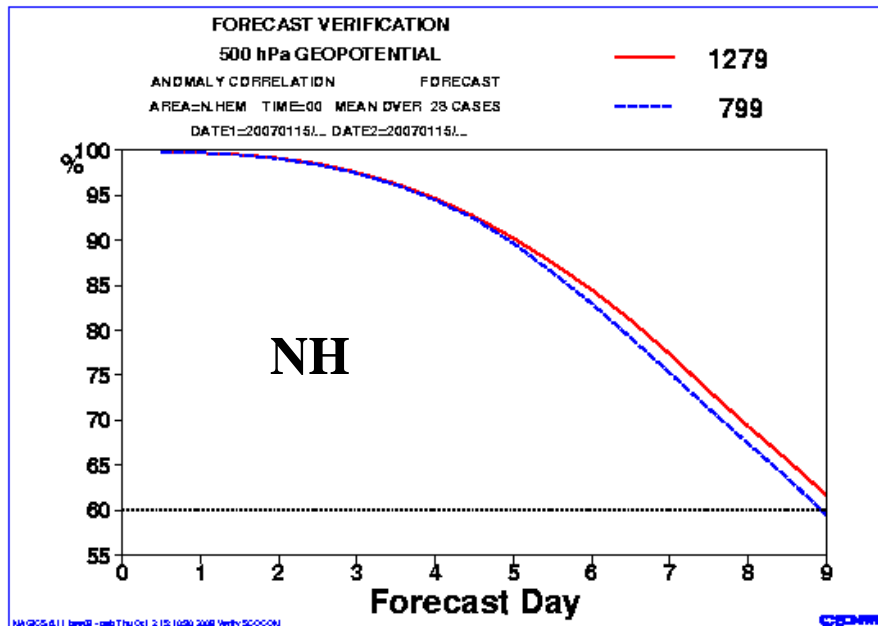
# Model resolution increase

- **The model spectral resolution will be increased from T799 to T1279 in 2009**
  - **The resolution increase of the assimilation and the EPS will be commensurate (T399 and T639 respectively)**
- **The model vertical resolution will be increased from 91 to about 150 levels in 2010**
- **By 2015, the deterministic model resolution could be T2047 (10km)**



# Increased realism via higher resolution (horizontal and vertical):

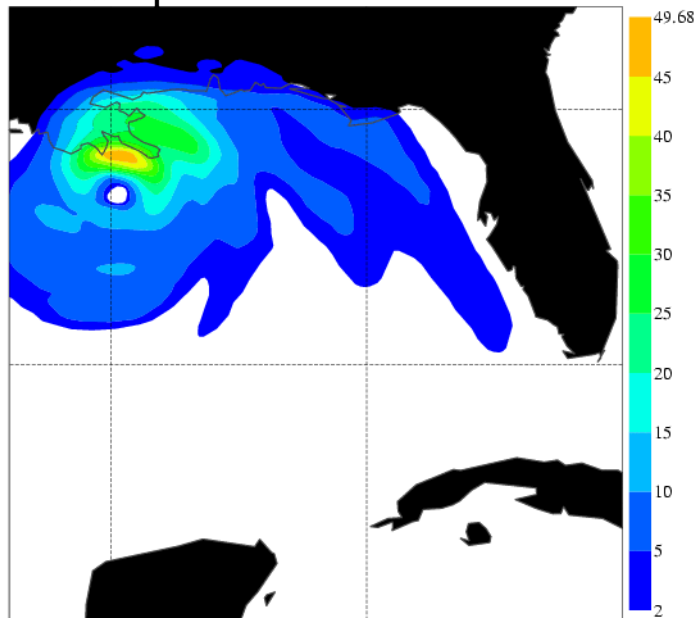
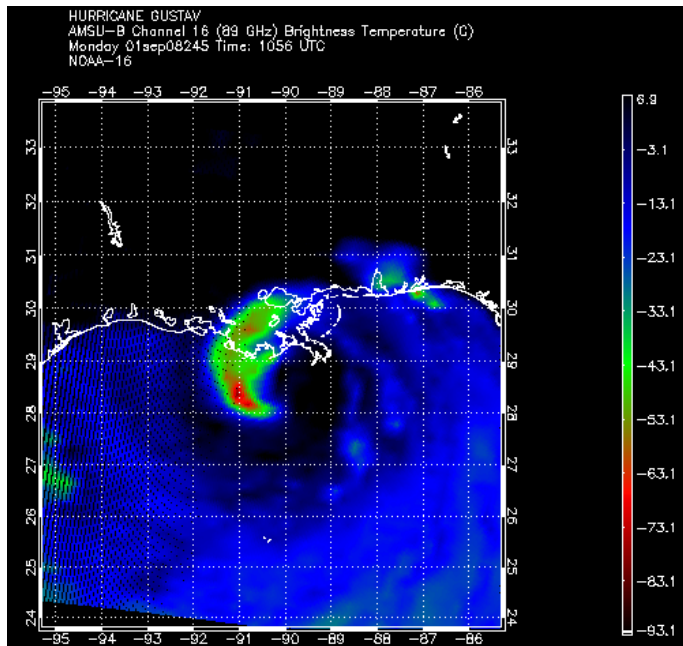
- T1279 (EPS at T639) planned for later next year
- T2047 run as a glimpse of the future



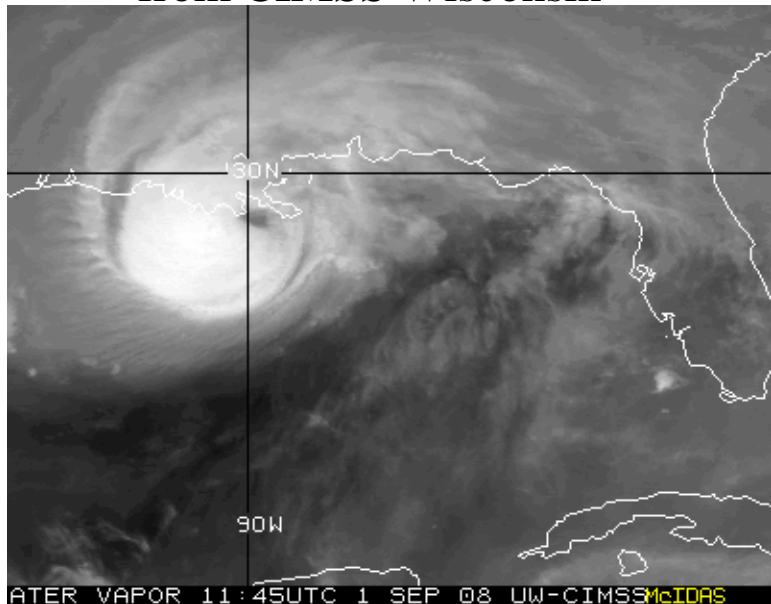
28 cases (forecast runs only, no assimilation)

# Hurricane Gustav AMSU-B and 33-36h rainfall

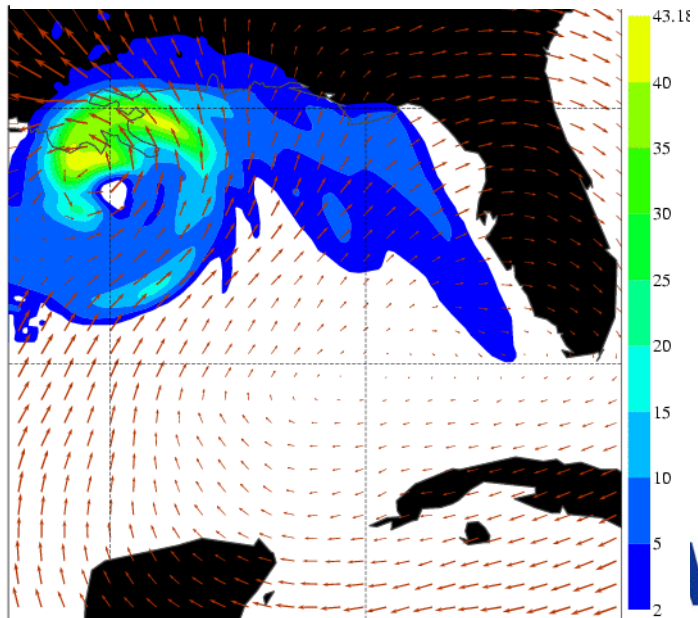
T799 oper 2008083100 +36h



from CIMSS Wisconsin

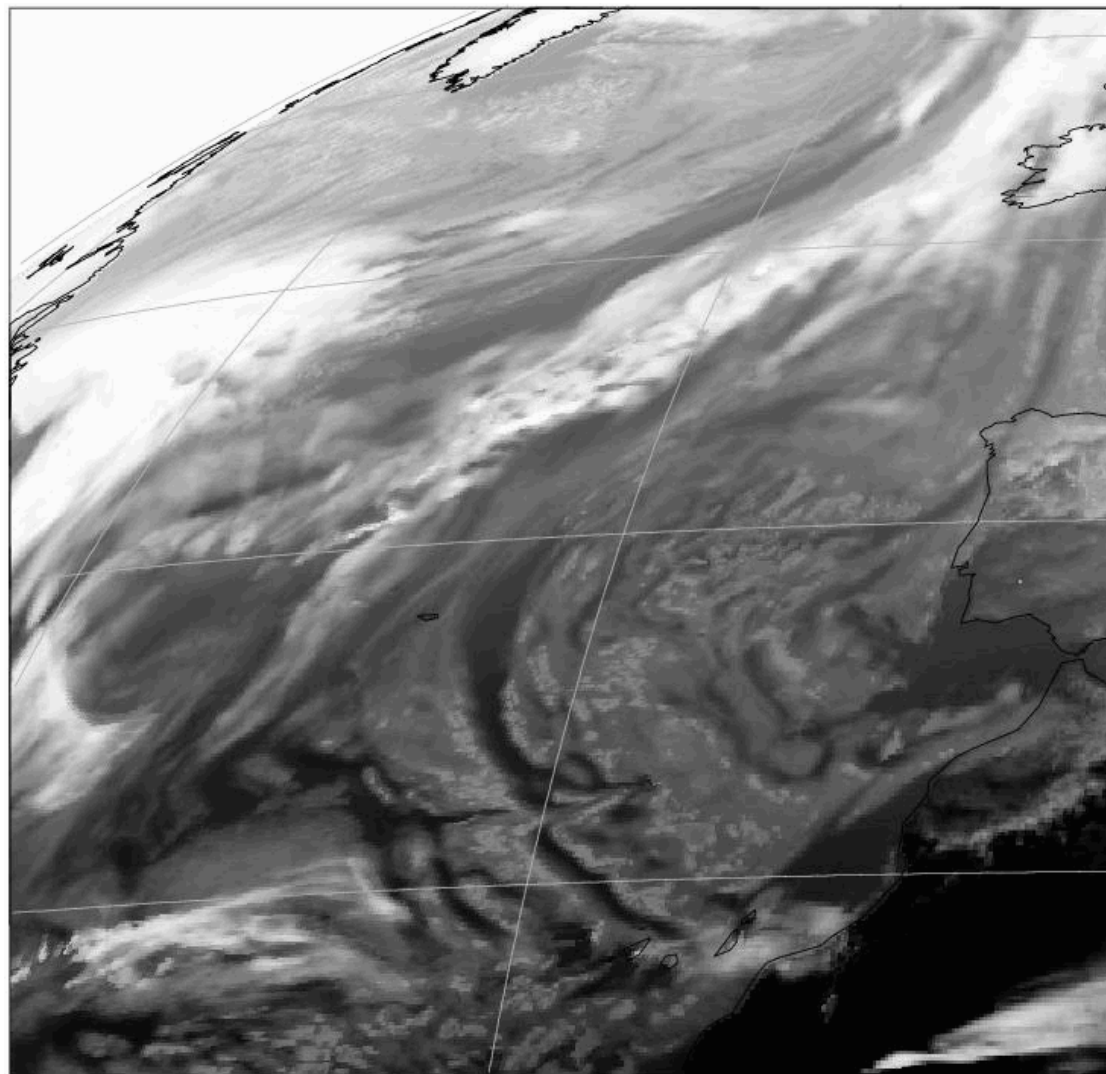


T1279 with 200hPa wind

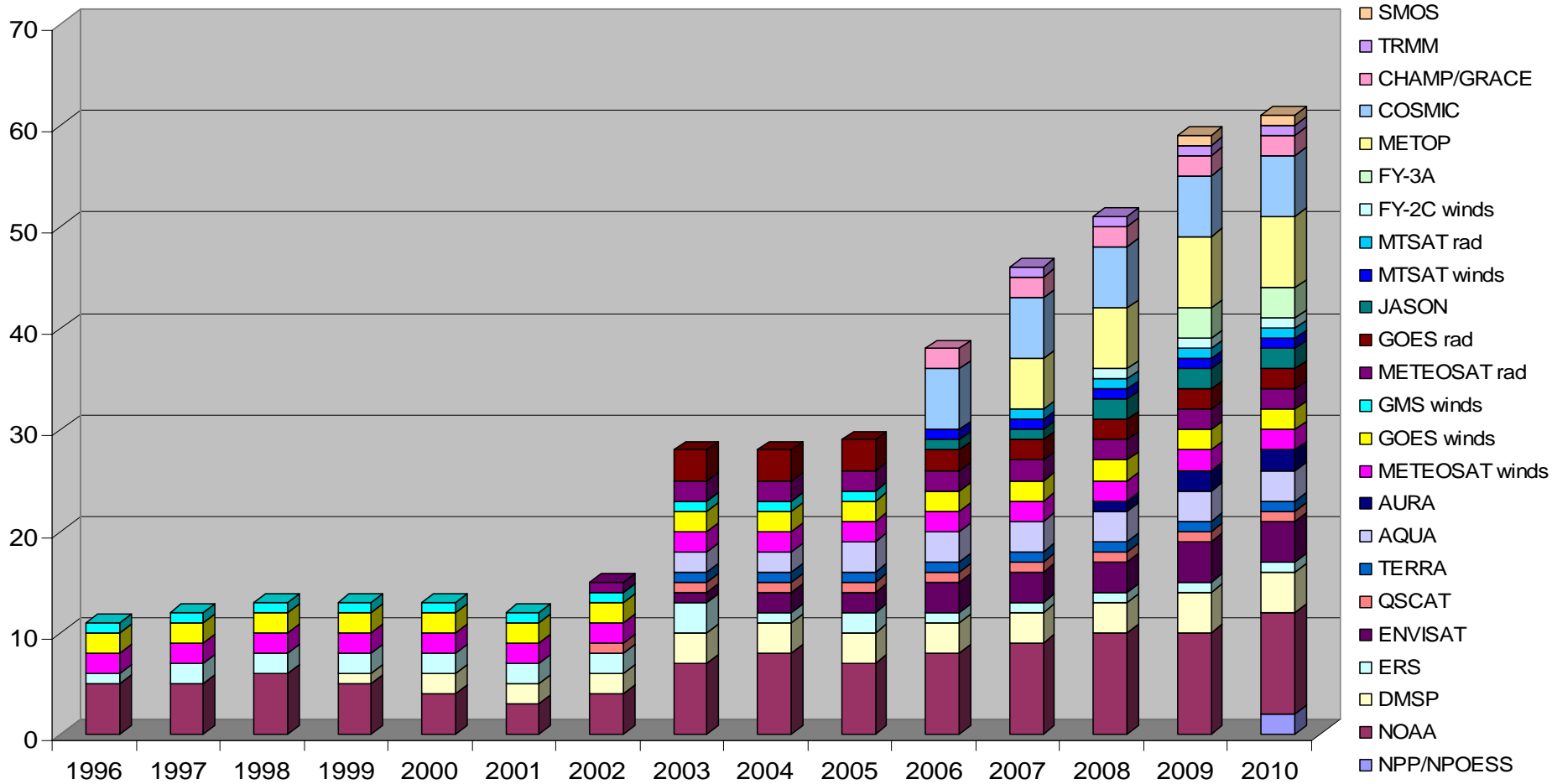


## Simulated infra-red cloud images at T2047 (10kms)

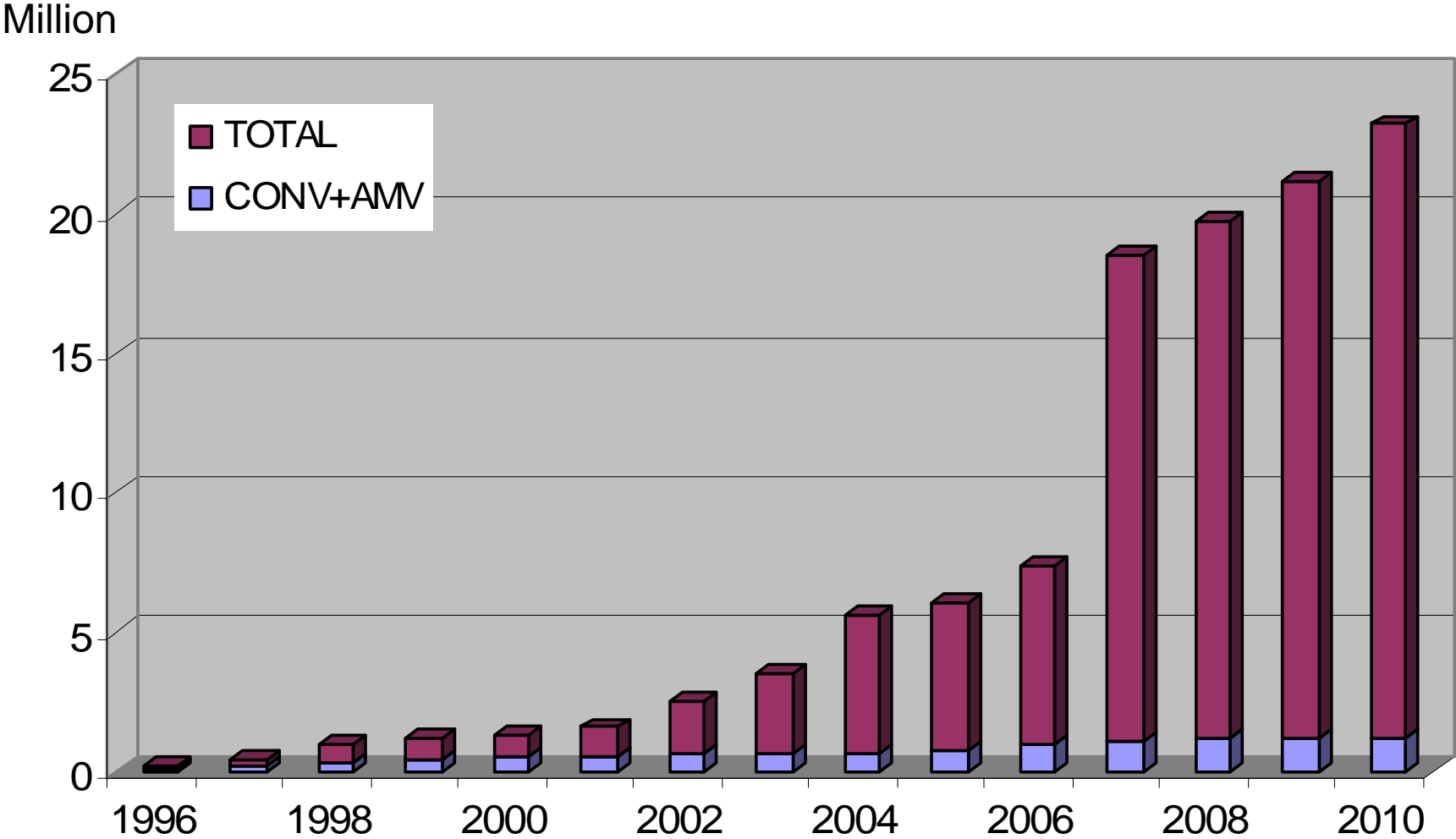
Simulated from a  
T2047 (~10km) forecast  
(15min output)



# Data sources assimilated at ECMWF



# Data volume assimilated at ECMWF



## Long window 4D-Var (Mike Fisher, Yannick Trémolet)

- **Extending the 4D-Var assimilation window is appealing because:**
  - **True equivalence with the Kalman filter at the end of the window**
  - **Use of all relevant observations to optimally estimate the atmospheric state**
- **Extending the 4D-Var window requires accounting for model error (Weak-constraint 4D-Var)**
- **A formulation, with a 4D-state control variable, has been developed**
  - **Which provides potential for extra-parallelism**

# Weak constraint 4D-Var

$$J(x) = \frac{1}{2}(x_0 - x_b)^T B^{-1}(x_0 - x_b) + \frac{1}{2} \sum_{i=0}^n [\mathcal{H}(x_i) - y_i]^T R_i^{-1} [\mathcal{H}(x_i) - y_i]$$
$$+ \frac{1}{2} \sum_{i=1}^n [x_i - \mathcal{M}_i(x_{i-1})]^T Q_i^{-1} [x_i - \mathcal{M}_i(x_{i-1})]$$

- Use  $\{x_i\}_{i=0,\dots,n}$  as the control variable.
- Incremental cost function:

$$J(\delta x) = \frac{1}{2}(\delta x_0 - b)^T B^{-1}(\delta x_0 - b) + \frac{1}{2} \sum_{i=0}^n (H\delta x_i - d_i)^T R_i^{-1} (H\delta x_i - d_i)$$
$$+ \frac{1}{2} \sum_{i=1}^n (q_i + M_{i-1}\delta x_{i-1} - \delta x_i)^T Q_i^{-1} (q_i + M_{i-1}\delta x_{i-1} - \delta x_i)$$

where  $b = x^g - x_b$ ,  $d_i = \mathcal{H}(x_i^g) - y_i$  and  $q_i = \mathcal{M}_{i-1}(x_{i-1}^g) - x_i^g$ .

- The model does not appear in the  $J_o$  term,
- In practice  $x_i$  is defined at regular intervals within the assimilation window.



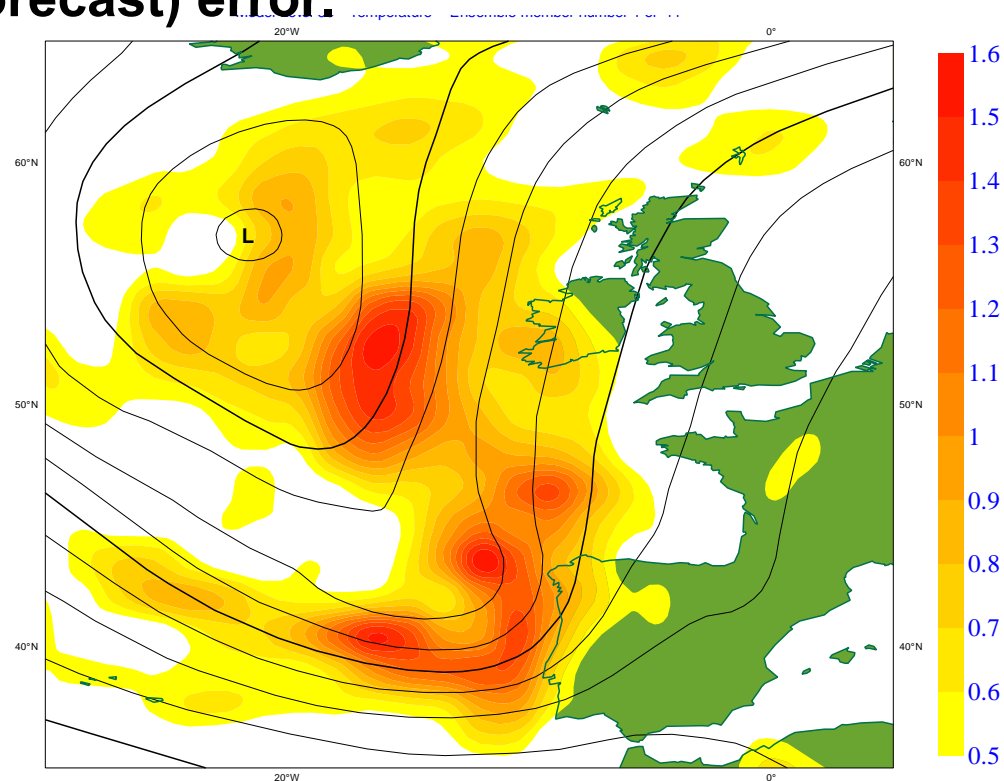


# Ensemble data assimilation

- Run an ensemble (e.g. 10 + 1 control) of analyses with random observation, SST field and model perturbations, and form differences between pairs of analyses (and short-range forecast) fields.
- These differences will have the statistical characteristics of analysis (and short-range forecast) error.

To be used in specification of background errors = “errors of the day”. To indicate where good data should be trusted in the analysis (yellow shading).

This is also used in the initialization of the EPS

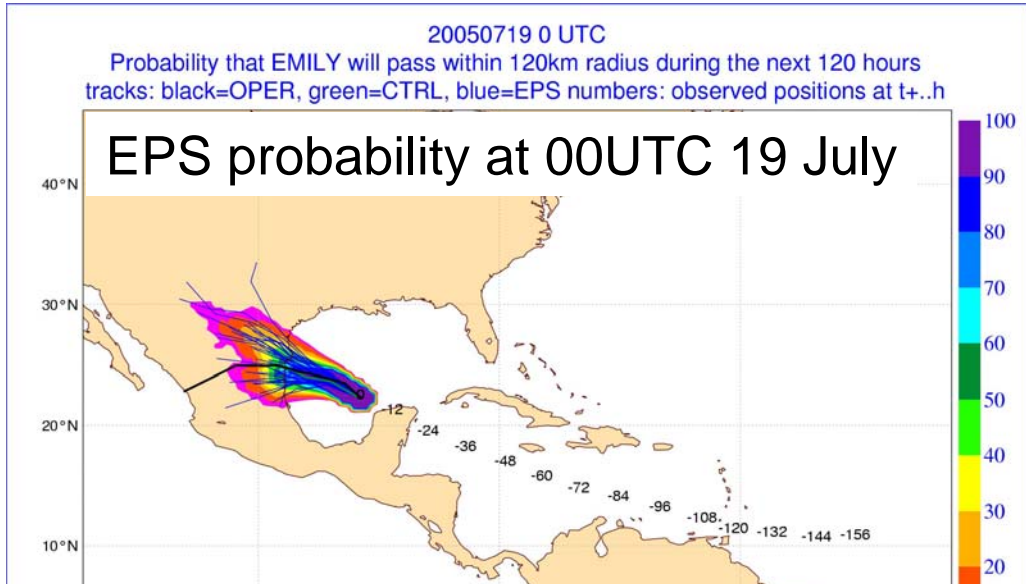
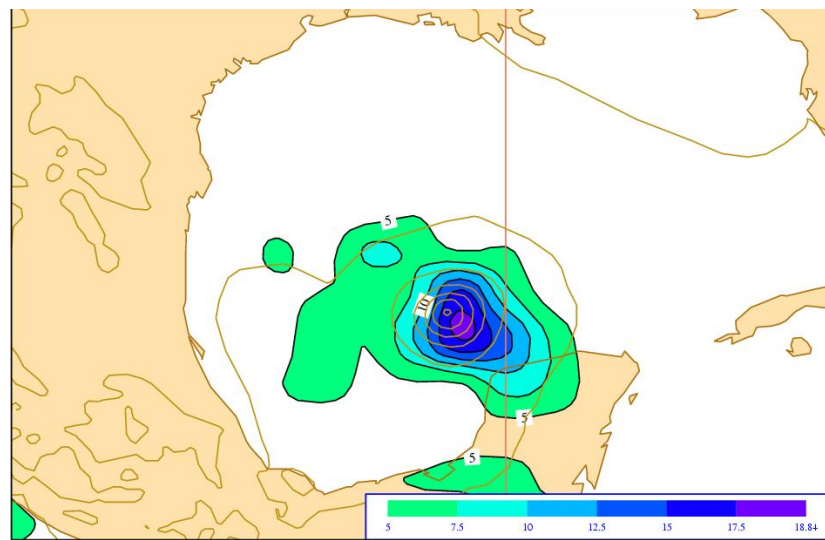


# Hurricane Emily 19-20 July 2005

## Ensemble Data Assimilation spread for zonal wind at 850hPa

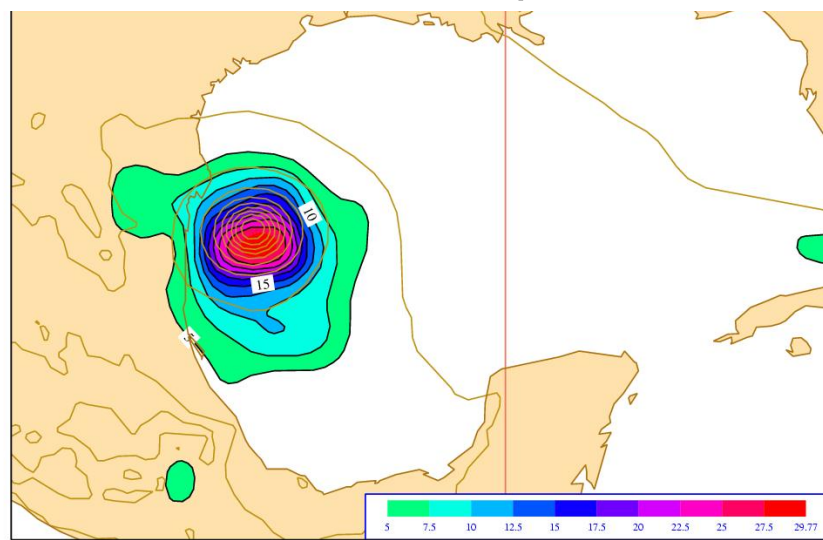
Ensemble DA 6h forecast spread for 850hPa u-wind T799 10 member ensemble valid 00UTC 19 July 2005

Max. stdev of EnDA spread 19m/s



Ensemble DA 6h forecast spread for 850hPa u-wind T799 10 member ensemble valid 00UTC 20 July 2005

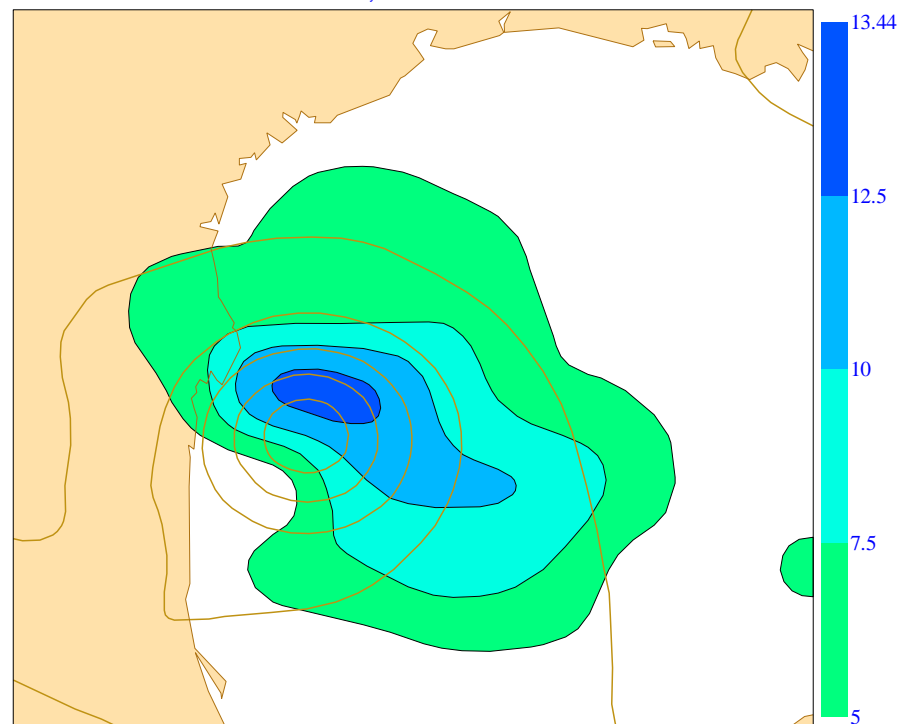
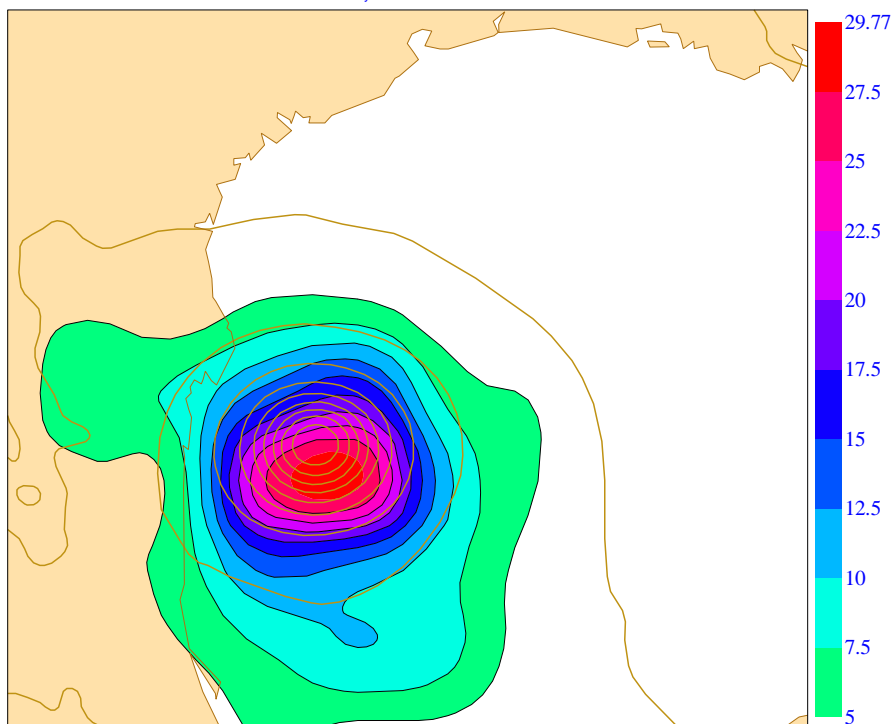
Max. stdev of EnDA spread 30m/s



# Tropical cyclone Emily 00UTC 20/7/2005 (resolution matters, sometimes...)

Tuesday 19 July 2005 18UTC ECMWF EPS Perturbed Forecast t+6 VT: Wednesday 20 July 2005 00UTC  
Surface: Mean sea level pressure (11 members)  
Tuesday 19 July 2005 18UTC ECMWF EPS Perturbed Forecast t+6 VT: Wednesday 20 July 2005 00UTC  
Model Level 78 U velocity - Ensemble member number 1 of 11

Tuesday 19 July 2005 18UTC ECMWF EPS Perturbed Forecast t+6 VT: Wednesday 20 July 2005 00UTC  
Surface: Mean sea level pressure (11 members)  
Tuesday 19 July 2005 18UTC ECMWF EPS Perturbed Forecast t+6 VT: Wednesday 20 July 2005 00UTC  
Model Level 78 U velocity - Ensemble member number 1 of 11



Standard deviation of zonal wind near 850hPa calculated from two 10-member EnDA ensembles. The contours represent the mean sea level pressure field (5hPa interval).

The right panel is for an ensemble with  $T_L 399$  outer loop and a single  $T_L 159$  inner loop.

The left panel is from an ensemble with  $T_L 799$  outer loop and two minimisations at  $T_L 95$  and  $T_L 255$ , respectively. Maximum spread values are  $13.44\text{ms}^{-1}$  for the lower-resolution ensemble, and  $29.77\text{ms}^{-1}$  for the  $T_L 799$  ensemble..

# Modularisation of the IFS (1) (Yannick Trémolet, Mike Fisher)

- **The IFS code is more than 20 years old. Over this period it has reached a high level of complexity, which is becoming a barrier to future scientific developments, and makes the ramp-up phase for new scientists/visitors unacceptably long.**
- **This makes the case for rethinking the design of the IFS (in particular the data assimilation)**
  - **All data assimilation schemes manipulate a limited number of entities (H, M, R, B, x, y, ...)**
  - **To adapt to future scientific developments, these entities should easily be accessible**
- **Information-hiding and abstraction are important: only those parts of the code that need to know about the detailed structure of some entity (e.g. model fields) should be exposed to it.**
- **Object-oriented languages (e.g. Fortran 2003) contain the features required to fully express these ideas.**

## Modularisation of the IFS (2)

- The main idea of abstraction is to separate the algorithm from the detailed implementation of the objects it deals with.
- This will be tried for the entire incremental 4D-Var algorithm.
- The result would be a 4D-Var framework into which we could plug a variety of models.
- Question to the audience:
  - Yannick ([yannick.tremolet@ecmwf.int](mailto:yannick.tremolet@ecmwf.int) tel: 2110)
  - Mike ([mike.fisher@ecmwf.int](mailto:mike.fisher@ecmwf.int) tel: 2622)
  - Would like to know more about the future F2003 compilers on forthcoming HPCs, and about any OO technologies at large on these future machines