## **ECMWF Forecasts: A tale about signal, noise, error and value**

The quest for perfect forecasts: recent achievements and issues

- Imperfect forecasts: how to use them (backwards and forwards probabilities)
- Extending useful forecast range

François Lalaurette, ECMWF

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## The quest for perfect forecasts

 Improving the forecasts through improved data assimilation, numerics, physics is what all NWP centres are aiming at -ECMWF is no exception!

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- Impressive progress has been achieved in recent years
  - →More and better use of satellite data
  - Revised convection
  - Improved 4D-var formulation
  - →Etc...



#### **Time series (N.Extratropics)**

http://www.ecmwf.int/products/forecasts/d/charts/verification/timeseries/monthly\_mean/



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#### **Time Series (S. Extratropics)**

http://www.ecmwf.int/products/forecasts/d/charts/verification/timeseries/monthly\_mean/







#### **Observing System Experiment Scores** (courtesy G. Kelly)

+ 2 winter months)

C

Satellite data are now the main source of information even in the NH

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#### **Summer 2003 vs previous summers**





#### **Summer 2003 vs previous summers**





#### Summer scores – has the N. America problem gone away?



2002



#### Summer scores – has the N. America problem gone away?





2003

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# Has the N. America problem gone away? Impact of revising the triggering of convection (courtesy P. Bechtold)

25R1

**25R4** 





## **Recent progress (winter temperature anomalies)**







## **Recent progress (winter temperature anomalies)**



#### Winter 2002-2003: the T511/T255 gap



#### **Recent progress – high resolution delivers...** (Courtesy A. Simmons)



## Impact of resolution: the 27/10/2002 storm

- A "classic" storm development over North-western Atlantic
- Impact of resolution meant a global shift in the ensemble distribution vs the T511 scenario

































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## T511 forecasts valid for 27/11 12UTC



20021024 12UTC ECMWF FC t+ 72 VT: 20021027 12UTC

20021024 00UTC ECMWF FC t+ 84 VT: 20021027 12UTC Surf: msl



20021022 12UTC ECMWF FC t+120 VT: 20021027 12UTC Surf: msl









20021023 12UTC ECMWF FC t+ 96 VT: 20021027 12UTC

Surf: msl

20021023 00UTC ECMWF FC t+108 VT: 20021027 12UTC Surf: msl

· 1020

1025

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## T255 (EPS Control) forecasts valid for 27/11 12UTC



20021024 12UTC ECMWF EPS Cont FC t+ 72 VT: 20021027 12UTC 20021024 00UTC ECMWF EPS Cont FC t+ 84 VT: 20021027 12UTC

980









1020

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1027

## T255 and T511 18h forecasts + Meteosat7 IR

















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# **ECMWF Forecasts: A tale about signal, noise, error and value**

The quest for perfect forecasts: recent achievements

#### Imperfect forecasts: how to use them (backwards and forwards probabilities)

• Extending the forecast range

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### The quest for perfect forecasts

- Improving the forecasts through improved data assimilation, numerics, physics is what all NWP centres are aiming at
- Impressive progress has been achieved in recent years
  - →More and better use of satellite data
  - →Revised convection
  - → Revised 4D-var formulation
  - →Etc...
- But what is the impact on our users?



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#### **Do improved forecasts bring greater appraisals?**

- 15 October 1987: the Great Storm
  - Weather forecasters are heavily criticised, TV weatherman Michael Fish comes in for a large amount of criticism after he answered a viewers query, 'a lady has rung in to ask if there is going to be a hurricane tonight ..... there is not!"
- 26-27 December 1999: Lothar and Martin
  - → Warnings for both storms were issued, but several newspapers criticised both 1) the underestimation of the winds speed (the first warning at 0400UTC on 26/12 forecasted 110 to 130km/h over IIe de France, but gusts > 150km/h were observed in many places) and 2) the timing (too late warnings)

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#### **Error and value**

#### NWP forecasts are wrong...

#### →But by how much?

- Modellers have their own metrics (Root Mean Square Errors, Anomaly Correlation) from which they can assess their global improvements
- Are these relevant for our users?

#### Decision making and value

- Is the knowledge of the meteorological forecast making a difference?
- And if the answer is "yes", can we measure the economic benefit of making meteorologically informed decisions?

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- Yes, but only if the error characteristics are known
- Not all applications will benefit from the forecast

#### **Economic Value**



### **Economic Value: Adding Probabilities**



Extra value added by the probabilistic forecast

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### **Probabilities are nothing new**

- Traditionally, probabilities have been used (implicitly) to make decisions in uncertain environments
  - →I cannot forecast the temperature in Rome a year ahead from today, but I know that it is *likely* to be warmer than in London
- Using probabilities adds value to dynamical forecasts
  - → Backwards if, when the model forecasts 10m/s, it still reached 20m/s or more in 10% of cases-> probability to get 20m/s or more will be set to 10% each time the model predicts 10m/s (the future will replicate the past)
  - Forwards given initial uncertainties and model errors attached to today's analysis, the probability of reaching 20m/s is... ( the future is governed by the laws of dynamics and uncertainties can be sampled by Monte-Carlo techniques: EPS)

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#### **Probabilities: Backwards and Forwards**

- Forwards probabilities are prone to errors that must be known before value is extracted
- Probabilistic errors can be evaluated/corrected by statistical treatment
  - Precipitation downscaling using subgrid scale error distributions
  - →EPSgram verification
- "Value extraction" is a very pragmatic approach
  - Mix parameters, forecast ranges, locations, thresholds (e.g. MOS, or Atger, 2001)
  - Maximum likelihood (Bayesian) or Maximum benefit/ protection?

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Should we care about probabilities?

#### Should we care about probabilities?

- As scientists, the answer is "yes"
  - The EPS problem is posed as a PDF forecast
  - Therefore, the forecast PDFs should be verified (Brier Scores, reliability, rank histograms, ...)
  - The probabilistic version of the quest for a perfect forecast...

- As users, the answer is "maybe"
  - EPS probabilities are imperfect
  - → So the alternative is between:
    - Calibrating probabilities (still you will have to use verification data to decide whether or not your application can benefit from the probabilistic forecast)
    - Or use the ensemble as raw input (together with verification data) for your decision-making strategy (maximum value extraction)



### **Statistics: can they solve all problems?**

- Value is highly dependent on the availability of sound verification statistics...
- ... but statistics only build up slowly and the more so the more the events definition is refined

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# **EPSgrams: Verification (with G. van der Grijn)**



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### **Statistics: can they solve all problems?**

- Value is highly dependent on the availability of sound verification statistics...
- ... but statistics only build up slowly and the more so the more the events definition is refined
- Extreme events are therefore likely to stay at the edge of statistical calibration: there is still therefore a need for... perfect models!
- Two attempts to build severe weather products from imperfect models:

The Extreme Forecast Index (EFI, see also H. Gmoser's presentation on Friday)

Tropical Cyclone Strike Probability maps
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#### **Severe weather products: EFI and TC tracks**

- Both products are based on an attempt:
  - →Not to calibrate extreme events forecasts
  - → But to "project" the forecast onto the model climate
    - The EFI measures the distance between the EPS probability distribution and the model climate one
    - Strike probability maps identify Tropical Cyclones within parameter ranges that are adapted to the model resolution/ physics representation



#### Maximum wind gust reported on 27 Oct. 2002





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### **Did T511 forecast such strong winds?**

Saturday 26 October 2002 12UTC ECMWF Forecast t+(12-36) VT: Sunday 27 October 2002 Surface: wind gust at 10m



- In the very short range, the wind gust estimates were spot-on for the Dutch, Welsh and East Anglia/ Kent coast lines
- The wind gust over land were underestimated significantly, most
   notably over South Germany, Switzerland, Austria and the Czech Republic on Sunday eve.

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 Friday 25 12UTC map had a good cover of
 both the English and Continental extent of
 the strong winds







Earlier forecasts

 increasingly suffered
 from the "slow
 moving" syndrome of
 the T255 runs - as
 discussed previously

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Earlier forecasts

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# EFI signatures (add heat wave?)



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At forecast time *t*, a TC is present at r(t). The first guess position vector for the next-track position  $r_{fg}$ at time  $t+\Delta t$  is based on a weighted combination of the previous displacement and the steering flow.

When the first guess  $(r_{fg})$  of the next track position is found, the tracker looks for a local minimum in mean sea level pressure (msl) within a certain radius around the first guess.

This msl minimum is considered to be a genuine TC if a local maximum of 850hPa vorticity and a local maximum of 850hPa-200hPa thickness is found in the vicinity.

#### **Tropical Cyclones forecast tracks: Basic description** (G. van der Grijn)





### **Special Topics: Tropical Cyclones**

Hurricane Isabel, 18 Sept. 2003 1555UTC MODIS on Terra, http://terra.ssec.wisc.edu



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### **Special Topics: Tropical Cyclones**



#### Hurricane ISABEL: impact of SSM/I-Rain Rate Assimilation on the **T511 forecast** (courtesy from P. Bauer, E. Moreau, P. Lopez, A. Benedetti, A. Tompkins, M. Janiskova et F. Chevallier)



ISABEL TRACK FORECAST (BASE: 2003091612) 80W 75W 70W



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#### 1D-Var results



Case of super-typhoon MITAG (5 March 2002 @1200 UTC) TMI data Surface rainfall rates (mm hr<sup>-1</sup>)

#### **New Tropical Cyclone Web Pages**

#### (G. van der Grijn, C. Sahin and C. Gibert)



🔟 🔜 🤒 🔲 Transferring data from nwmstest.ecmwf.int..



#### **Tropical cyclone EPS probabilities: impact of diabatic, targeted perturbations**



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# **ECMWF Forecasts: A tale about signal, noise, error and value**

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Extending the forecast range

François Lalaurette, ECMWF

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### **Extending the forecast range**

- ECMWF has been created in 1979 with the main objective of extending the range of numerical forecasts into the medium range
- Was it successful?
  - Yes, looking at how good the Day 5 forecasts are today compared to what they were at the time
  - But the vast majority of applications in Member States remain focused on the short range (1-2 days), medium range being merely an "outlook"
- So can we extend the "useful" forecast range?
  - → For this we have both to improve the forecasts AND tell the users that decision making in the early medium range is a risky, but potentially rewarding business...

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### **Extending the forecast range**

- Early Medium Range: severe weather
- Medium-Range: beyond the 10-days limit...
- Extended medium range: Monthly forecasts
- Long-range: beyond 6 months
- Towards a "seamless" ensemble forecast system? E.g.
  - > T399(50 km) to D+7 twice daily
  - > continue once a day at T255(80 km) to D+15
  - > continue twice a week at T159(123 km) to D+30, in coupled mode



#### Impact of a resolution increase on precipitation (courtesy R. Buizza)

A resolution increase from  $T_L 255$  to  $T_L 399$  would have a large impact on the quality of 12h-accumulated precipitation: ~12h predictability gain for 5 and 20 mm thresholds on average over NH (results based on 34 cases, cy23r4 and 25r5).





#### VAREPS (R. Buizza/ N. Wedi): an approach to reduce the EPS production costs

#### **VAREPS** project:



- phase 1: deterministic forecasts only (cy23r4)
- phase 2: test of T511>T255 VAREPS systems

(cy23r4, 24r3, 25r1)

- phase 3: investigation of precipitation issue (cy26r3)
- phase 4: complete technical developments (MARS modifications to support VAREPS type; modifications to the wave part of the code)
- phase 5: test of full system



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#### VAREPS Ph2: VAR5 (T<sub>L</sub>511>T<sub>L</sub>255) gives best Z500 fcst (R. Buizza/ N. Wedi)

Average control (left) and ensemble-mean ACC skill (12 cases, Z500, NH). Best is VAR5.





#### **VAREPS Ph2: TP-spread problem**

The truncation step of the VAREPS system affect the ensemble spread.

The ensemble-spread decreases during the 12 hours after the interpolation step from  $T_L511$  to  $T_L255$ , and then recovers to  $T_L255$  levels.





#### **ROCA** confirms the small impact of a size reduction

ROCA for the prediction of Z500 anomalies (with respect to climatology): the impact is very small for positive anomalies (topright), but detectable for +/anomalies of  $1.5\sigma$  (bottom).

IMEAN=1 - NEXP=4

51 winter

31 winter

51 summer

31 summer

Δ

DAY

2

**40.9 40.9 40.9 40.9** 

0.7



6

8

10

N. Hem. THR= 0.15E+01

#### Martin, December 1999: operational SV configuration



Mean sea level pressure, fc+48h, VT: 19991228, 0UT ensemble ed9x: T255 Ens using NH-SVs ed72, RNORM=1. SVs: T42 dry TLM SVs for NH, topt=48h

c - mem no. 1 of 51 fc - mem no. 2 of 51 fc - mem no. 3 of 51 fc - mem no. 4 of 51 fc - mem no. 5 of 51 fc - mem no. 6 of 51 fc - mem no. 7 of 51 fc - mem no. 8 of 51 fc - mem no. 9 of 51 fc - mem no. 10 of 51



fc - mem no. 11 of 51 fc - mem no. 12 of 51 fc - mem no. 13 of 51 fc - mem no. 14 of 51 fc - mem no. 15 of 51 fc - mem no. 16 of 51 fc - mem no. 17 of 51 fc - mem no. 18 of 51 fc - mem no. 19 of 51 fc - mem no. 20 of 51



c - mem no. 21 of 51 fc - mem no. 22 of 51 fc - mem no. 23 of 51 fc - mem no. 24 of 51 fc - mem no. 25 of 51 fc - mem no. 26 of 51 fc - mem no. 27 of 51 fc - mem no. 28 of 51 fc - mem no. 29 of 51 fc - mem no. 30 of 51



fc - mem no. 31 of 51 fc - mem no. 32 of 51 fc - mem no. 33 of 51 fc - mem no. 34 of 51 fc - mem no. 35 of 51 fc - mem no. 36 of 51 fc - mem no. 37 of 51 fc - mem no. 38 of 51 fc - mem no. 39 of 51 fc - mem no. 40 of 51



c - mem no. 41 of 51 fc - mem no. 42 of 51 fc - mem no. 43 of 51 fc - mem no. 44 of 51 fc - mem no. 45 of 51 fc - mem no. 46 of 51 fc - mem no. 47 of 51 fc - mem no. 48 of 51 fc - mem no. 49 of 51 fc - mem no. 49 of 51 fc - mem no. 40 of 51 f



(Shading: 960 – 990 hPa)



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#### Martin, December 1999: Testing Moist Singular Vectors



Mean sea level pressure, fc+48h, VT: 19991228, 0UT ensemble ed9z: T255 EPS using NH-SVs ed74, RNORM=1. SVs: T63 moist TLM SVs for NH, topt=24h

fc - mem no. 1 of 51 fc - mem no. 2 of 51 fc - mem no. 3 of 51 fc - mem no. 4 of 51 fc - mem no. 5 of 51 fc - mem no. 6 of 51 fc - mem no. 7 of 51 fc - mem no. 8 of 51 fc - mem no. 9 of 51 fc - mem no. 10 of 51



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ic - mem no. 21 of 51 fc - mem no. 22 of 51 fc - mem no. 23 of 51 fc - mem no. 24 of 51 fc - mem no. 25 of 51 fc - mem no. 26 of 51 fc - mem no. 27 of 51 fc - mem no. 28 of 51 fc - mem no. 29 of 51 fc - mem no. 30 of 51



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(Shading: 960 – 990 hPa)

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#### Tests of moist 1-day SVs in the EPS (T255) – courtesy M. Leutbecher

Storm	verification	observed	range	$\Delta p_{\rm c}$	$\Delta s$	# of forecasts			Improve
name	date	$p_{c}$ (hPa)	(h)	(hPa)	(km)	old	new	1+2	ment
Oct87	19871 <b>0</b> 1612	957	96	5	600	9	9	14	0/+
Oct87	19871 <b>0</b> 1612	957	72	5	600	4	13	13	+/+
Oct87	19871 <b>0</b> 1612	957	48	5	600	3	7	12	+/+
Lothar	1999122606	961	78	10	600	8	13	3	+/-
Lothar	19991226 <b>0</b> 6	961	54	10	600	8	11	17	+/+
Lothar	19991226 <b>0</b> 6	961	30	5	200	6	7	4	+/
Martin	1999122800	970	120	10	600	8	1	2	_/_
Martin	1999122800	970	96	10	600	5	12	10	+/+
Martin	1999122800	970	72	10	600	2	5	10	+/+
Martin	1999122800	970	48	5	300	1	4	3	+/+
							Ť		
old=op	perational SV	new=moist T63, 1-day SVs				SVs			

Config "1+2": moist 1-day TL95 SVs and dry 2-day TL95 subspace SVs, Gaussian sampling of initial and evolved SVs.

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### **Summary / discussion**

- The quest for perfect forecasts has been a powerful and successful driver for model improvements at ECMWF
- Meteorologists however only reduce the value of their forecasts by being shy about their errors
  - Not all "meteo-sensitive" applications can benefit from meteorological forecasts
  - Users should not be trusted to define their requirements in terms of accuracy of the forecasts (only hits/misses ratio, or even better – through economic/ social value estimates)



# Summary / discussion (2)

- The calibration of probability forecasts is a new issue
  - →Can it be done in a "one size fits all" type of application?
  - Or should users be provided with Ensemble Direct Model Output <u>AND</u> (tailored) verifying statistics/ climatology?
- Future developments aim at extending the forecast range of useful (but imperfect) forecasts
  - → By getting even closer to "perfect"
  - By improving on the reliability of "forwards" probability/ apriori estimates of errors (more in Tim Palmer's presentation later today)
  - ... and by running the models over extended ranges (more in Laura Ferranti's presentation on Friday)

