

MINISTERIO DE MEDIO AMBIENTE Y MEDIO RURAL Y MARINO



Probabilistic Forecast of Severe Weather Events: The long way to the mesoscale

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Acknowledgements: A. Callado, P. Escriba, J. Montero, C. Santos, D. Santos, J. Simarro (AEMET); Ken Mylne, Nigel Roberts (UKMO); Susanne Theis (DWD); Anna Ghelli (ECMWF)

Introduction

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- Main Weather Forecast issues are related with Short-Range forecast of extreme events.
- Convection and convective precipitation are, roughly speaking, the most dangerous extreme weather events.
- Due to the small spatial and temporal scales of these events, forecast is very difficult.
- Increasing the horizontal and vertical resolutions of the numerical weather prediction models has been the traditional approach to improve the forecast of these events.
 - But deterministic tools, like mesoscale NWP models, didn't show the improvement expected in the last 20 years or so.

Uncertainty

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- In the last 80's and beginning of 90's some studies show that the effects of the Chaos theory has to be taken into account in medium-range weather forecasting (ECMWF).
- + Uncertainty of the weather forecast was introduced through + +probabilistic tools, like the Ensemble Prediction Systems, EPS (NCEP, ECMWF). + +
 - At the same time mesoscale models with resolution below 5 Km (MM5) show similar behaviour when they were used to deal with convection.
 - In the last years some experiments with mesoscale EPS have shown some skill in the information about the uncertainty of convective events.

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Mesoscale EPS

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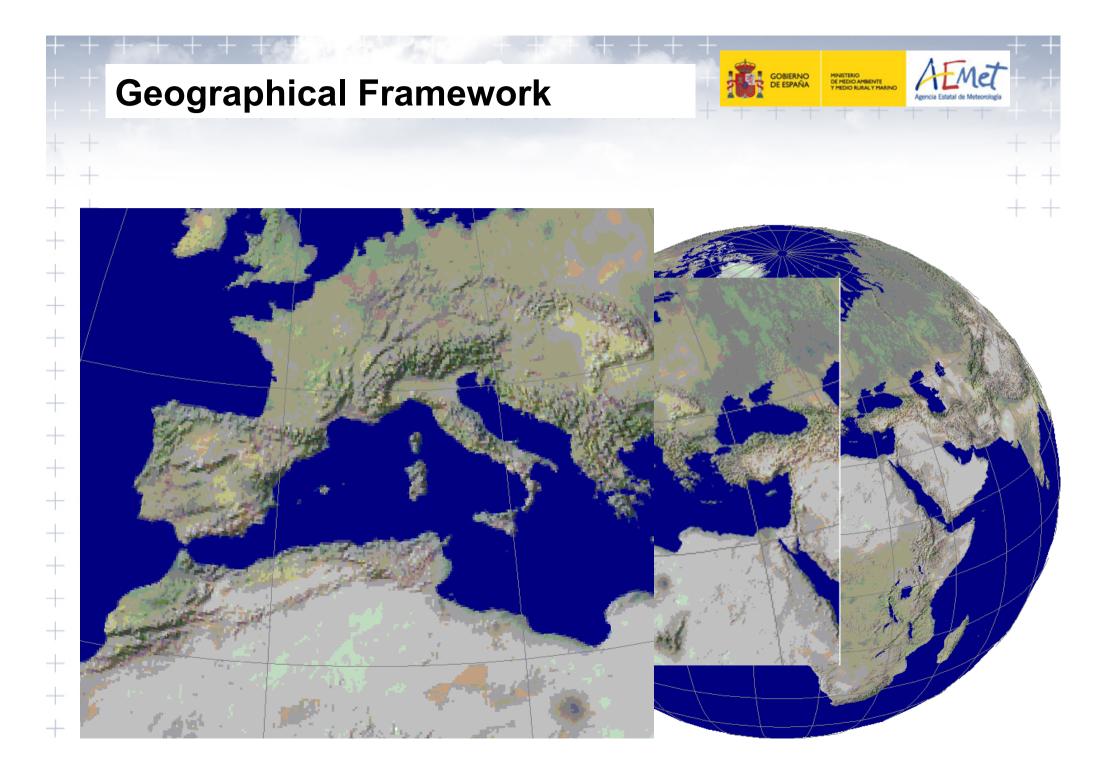
- Probabilistic tools has shown to be very useful in the forecast of extreme weather events.
- At medium-range the ECMWF Extreme Forecast Index (EFI) is being very wide used in the European Weather Services.

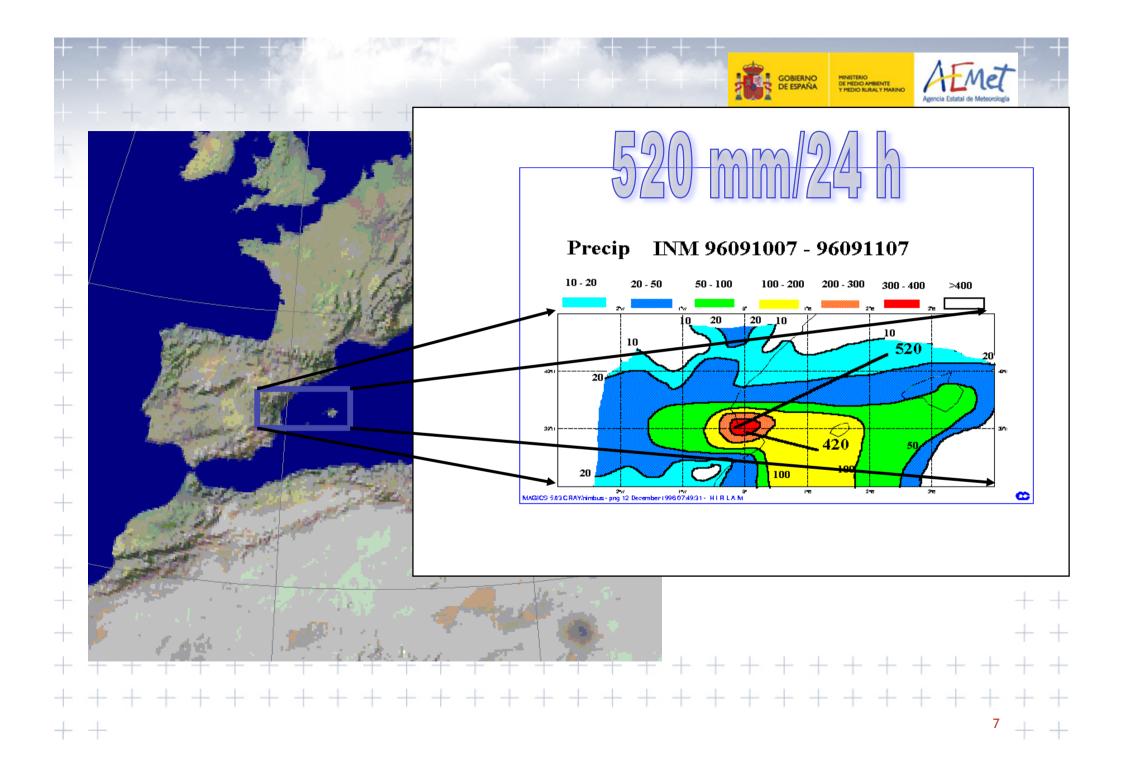
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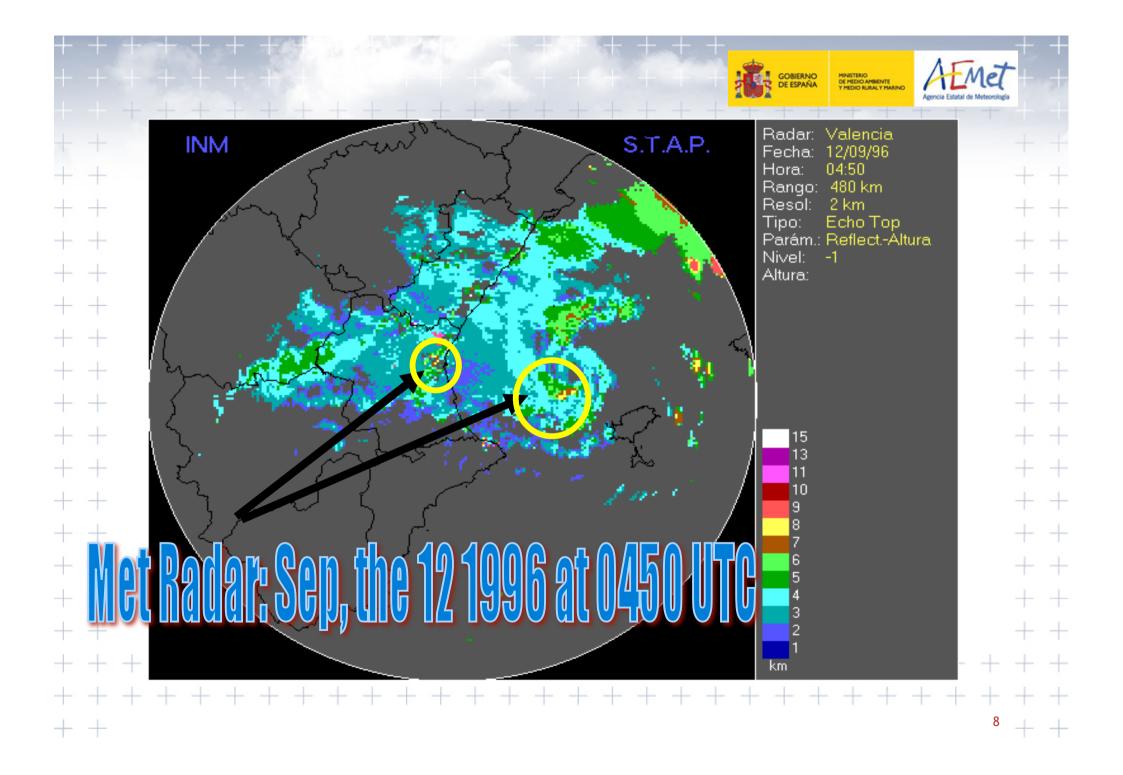
- At short- and very short-ranges Met Services in Europe and
 around the world are doing parallel tests of mesoscale EPS
 (convection-permitting resolution).
- The huge amount of computer resources needed to run
 operationally mesoscale EPS is one of the key aspects that
 has to be taken into account.
- + + Then a compromise among forecast length, domain size,
 + + number of members, periodicity of runs and so on are key
 + + aspects of those operational mesoscale EPS.

Examples in Spain

- Western Mediterranean is a close sea rounded by high mountains.
- In autumn sea is warmer than air.
- Several cases of more than 200 mm/few hours occurs every year.
- Some fast cyclogenesis like "tropical cyclones" also appears from time to time (called "medicanes" in the literature).







Mesoscale Deterministic Models

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- Such events can be model with very high resolution NWP models.
- But phase errors in space and time make very difficult to use these models in operational environments.

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- In particular, point-to-point objective verification tools normally give better skill to smoother-lower resolution models.
- New methods like SAL index are using to give proper opportunities to mesoscale models.
- The key question is how to properly compare 2 or 1 Km resolution models with outputs every few minutes, with observations at completely different scales (10-20 Km with recording every 24 hours or 50-100 Km recording every hour).

SAL

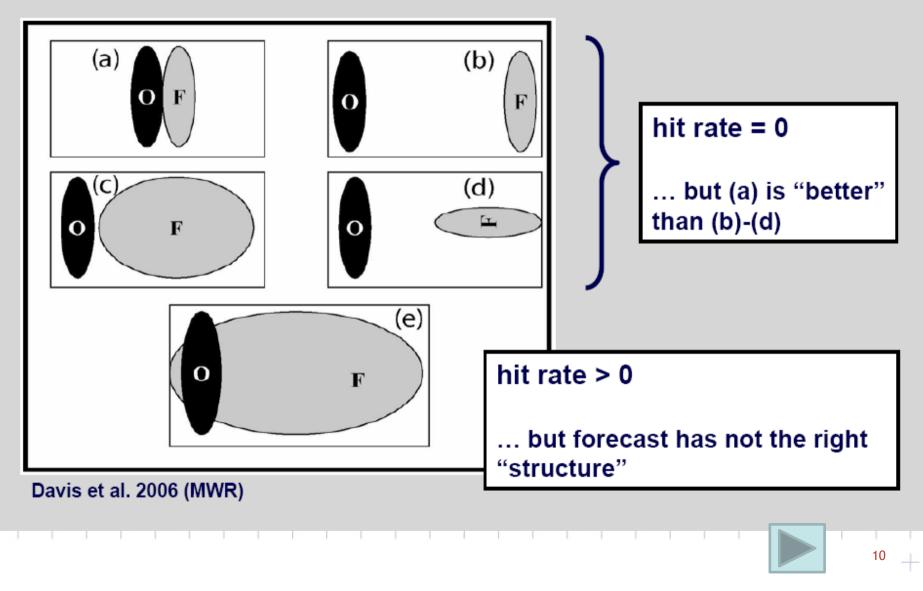
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Problematic aspects of grid point based error scores



SAL

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•	Classical problem of double penalty
•	Feature-oriented \rightarrow ~ subjective verification
•	E.g: SAL measure
	 S (Structure)
	 A (Amplitude)
	 L (Location)
•	Perfect forecast: $S = A = L = 0$
•	S requires patterns/objects definition, currently simple algorithms, need improvement
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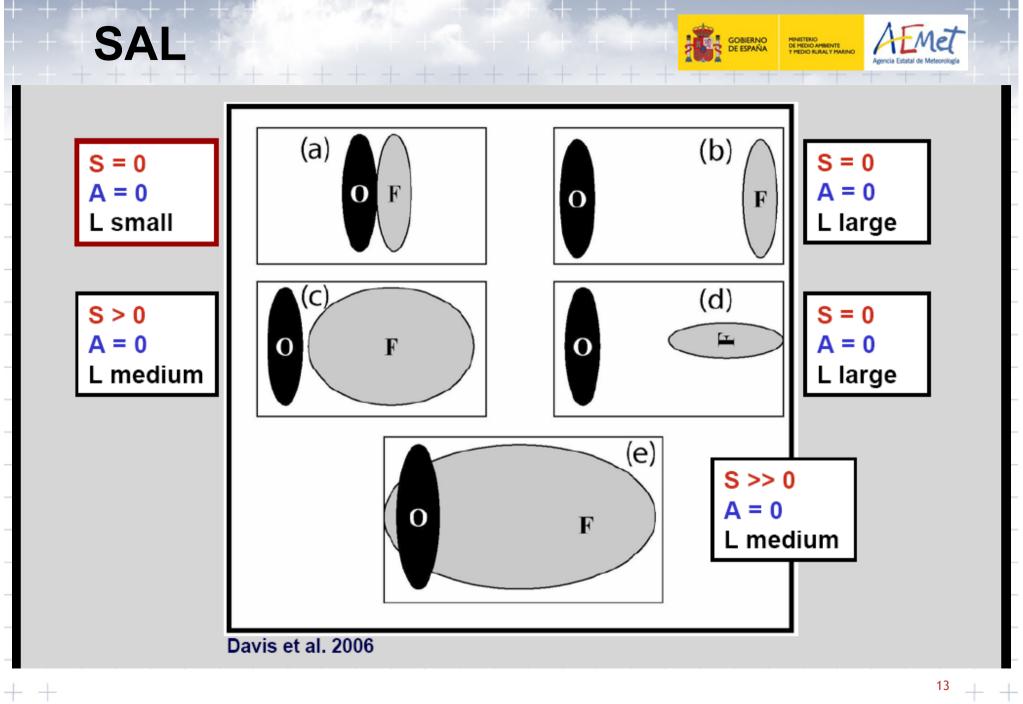
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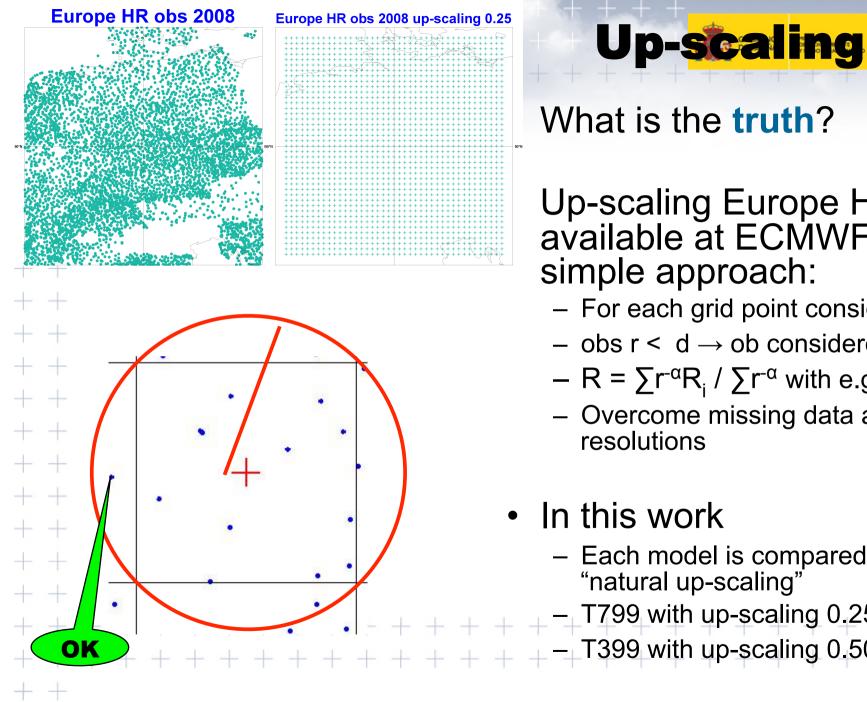
SAL

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S: **Structure** +2 -2 0 objects Perfect objects too small or too large or too peaked too flat +2 **A**: **Amplitude** -2 0 Perfect averaged averaged **QPF** under-QPF overestimated estimated **Location** +2 L: 0 wrong location of Perfect **Total Center of Mass** (TCM) and / or of objects relative to TCM + + + + + + + + + + + + -12 + +

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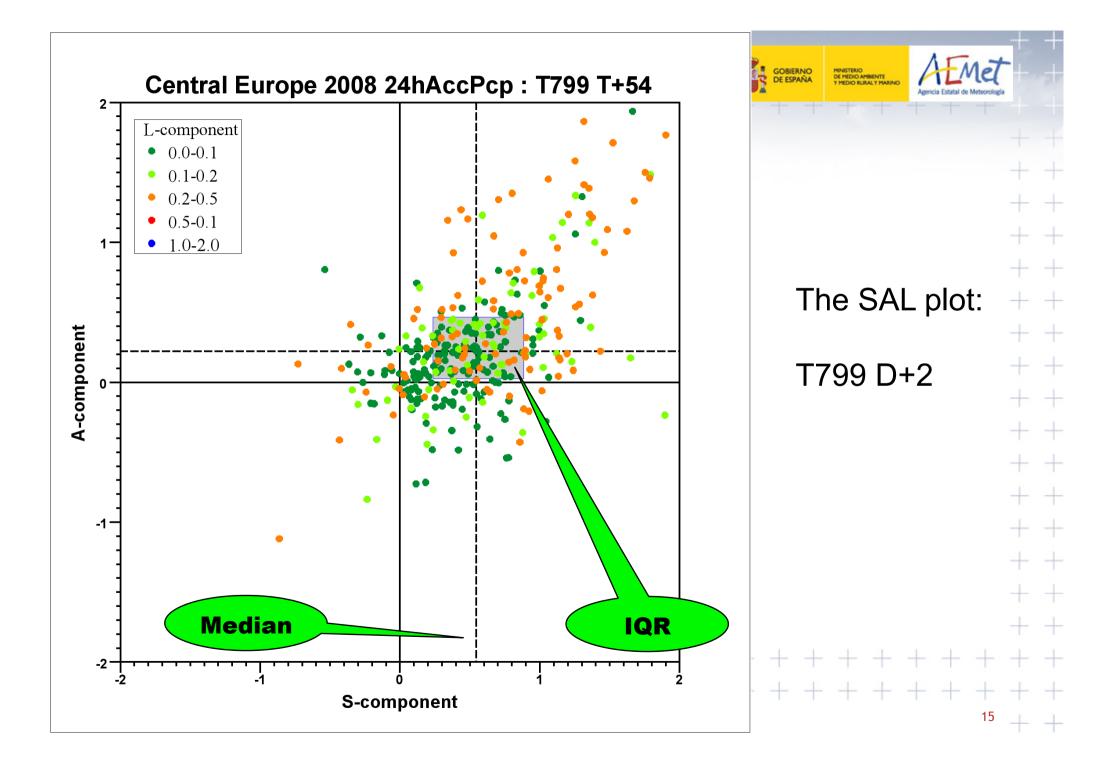


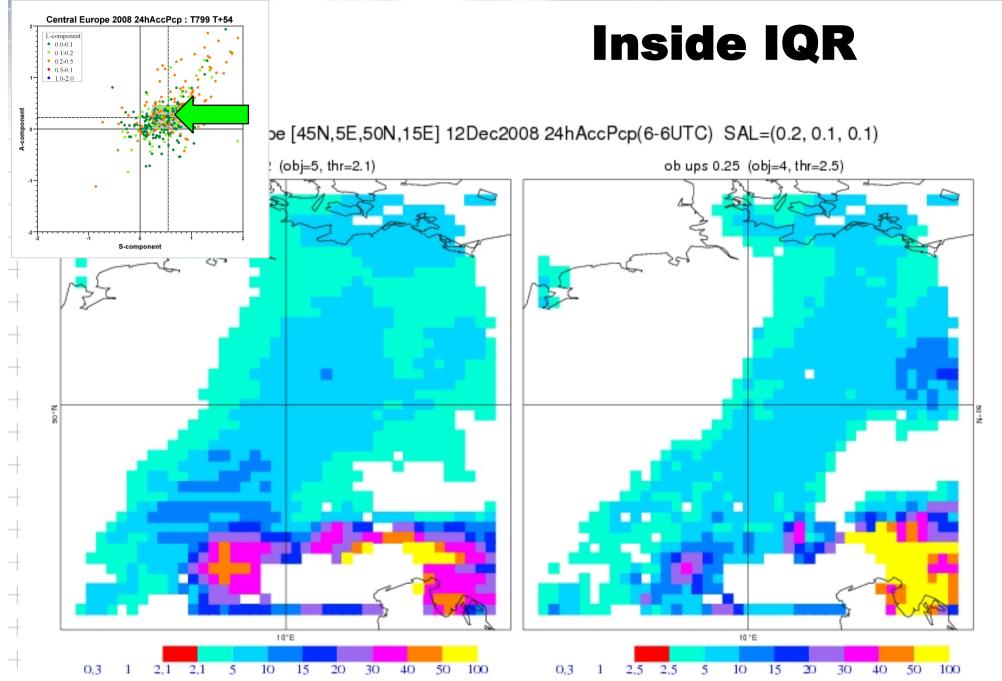


What is the **truth**?

Up-scaling Europe HR obs available at ECMWF: a first simple approach:

- For each grid point consider d
- obs r < d \rightarrow ob considered
- $-R = \sum r^{-\alpha}R_i / \sum r^{-\alpha}$ with e.g. $\alpha = 2$
- Overcome missing data at most resolutions
- In this work
 - Each model is compared with its own "natural up-scaling"
 - T799 with up-scaling 0.25
 - T399 with up-scaling 0.50





Probabilistic tools from deterministic models

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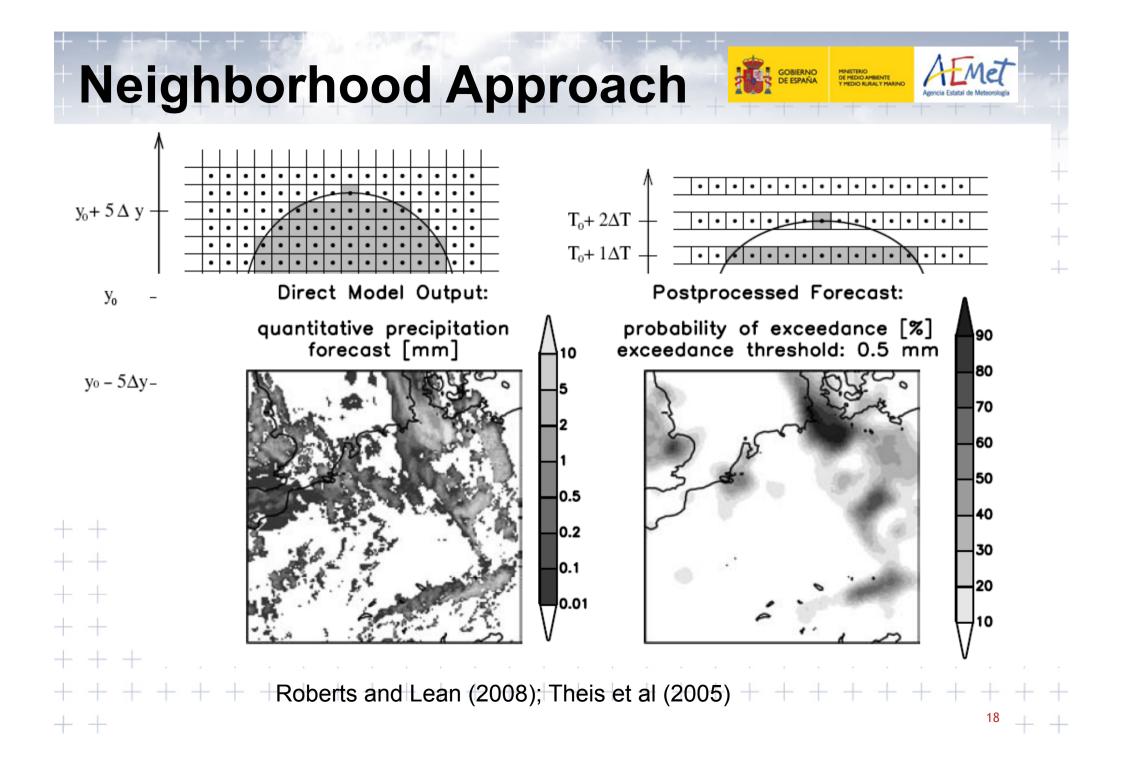
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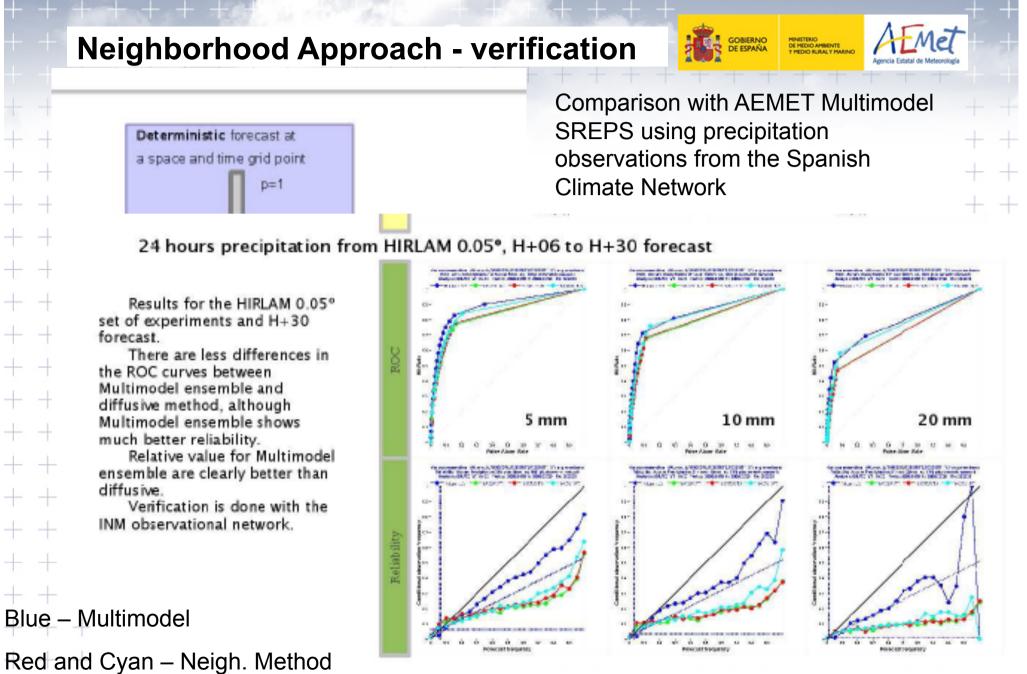
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 To avoid the problem of computer resources needed to run a mesoscale EPS there are some techniques to get probabilities from deterministic numerical models.

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- The <u>neighbourhood method</u> which consists in compute probabilities using data from gridpoints around the target one:
 - Only in space giving a circle or an ellipse.
 - Or in space and time giving a ball or a bowl.





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Hybrid Methods

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- The Concept of Hybrid EPS (Du, J., 2006)
 - Each EPS member could be decomposed into two parts:

EPS member = base + *perturbation*

- The high-resolution model could be considered as better base: *high resolution base* = deterministic forecast
- A new Hybrid Ensemble could be obtained exchanging the bases: Hybrid EPS member = high resolution base ± perturbation ("two side approach")
- The **base** is the control member from EPS which is more close in dynamics and physics to the high resolution deterministic forecast
- Du, J., 2006: Hybrid Ensemble Prediction System: a New Ensembling Approach. Workshop on Predictability, Observations, and uncertainties in Geosciences, 13-15 March 2006, Tallahassee, Florida,

[3] Santos, C. et al., 2007: Performance of the INM Short Range Multi-Model ensemble using High-resolution Precipitation Observations. 3rd International Verification Methods Workshop, ECMWF.

^[2] García-Moya, J.A. et al., 2007: Multi-model Ensemble for Short-Range Predictability. 3rd International Verification Methods Workshop, ECMWF.

Hybrid Methods - Example

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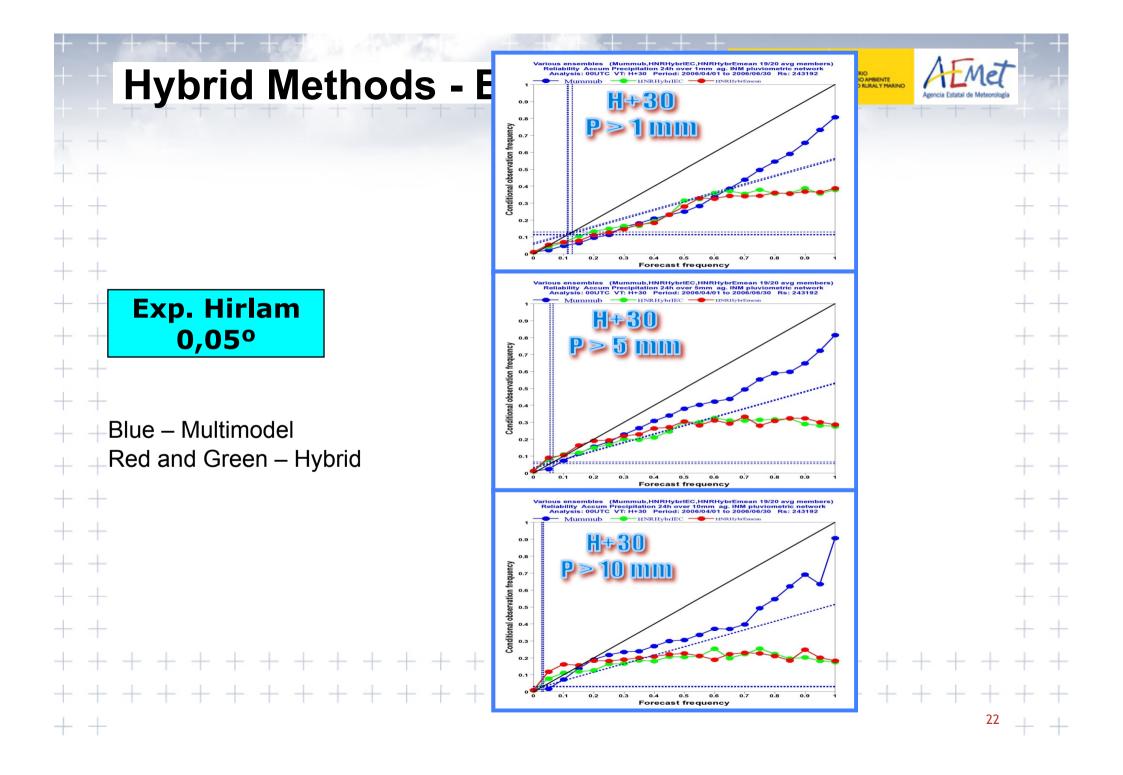
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- Two high resolution deterministic models are currently running at the Spanish Met Service (INM).
- A Short-Range Ensemble Prediction System (SREPS, García-Moya, J.A., *et al.*, 2007) is daily running at INM as well, but a lower resolution.

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- A goal could be combine both systems in order to improve the quality of the probability forecast, especially the precipitation forecast.
- A few Hybrid Ensemble has been developed and verified.
 - Combine the spread or uncertainty information from the coarse EPS with the more detailed and higher accuracy deterministic model in order to form a more robust ensemble: the Hybrid Ensemble.



Pure EPS Methods

Main goal:

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• Sampling phase space by taking into account:

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- Initial conditions perturbations.
- Model errors, mainly Physics.
- Boundary conditions perturbations.
- Validation and verification:
 - Spread (spread-skill diagram, Talagrand histogram).
 - Reliability (reliability diagram and sharpness).
 - Resolution (ROC curves).
 - Brier Skill Score.

 $\begin{array}{c}++\\++\\++\\++\\+\\+\end{array}$

Characteristics: Initial condition perturbations: EDA + SVs. Model errors: Physics Stochastic Scheme. 51 members. \sim 30 Km horizontal resolution. Goal: Forecasting severe weather at medium-range. ٠ Tool: • Extreme Forecast Index (EFI). + Measures how far away from the model climate distribution the actual EPS forecast is. -It scales from -1 to 1 (all members reach respectively unprecedented small and unprecedented large values). **Disadvantage:** Computing periodically (weekly) the climate of the numerical model for calibration. 24 + +

Medium-Range Forecast - ECMWF

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EFI - Example





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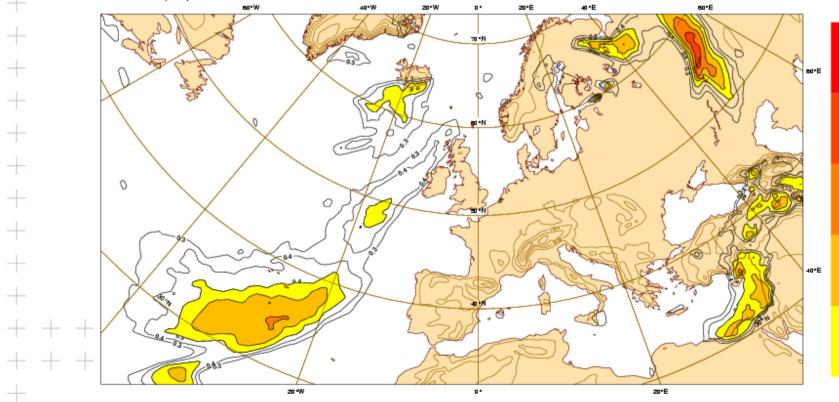
0.7

0.6

0.5

• Computing integrated EFI for wind (speed and gusts), temperature and precipitation.

Frida y 23 September 2011 00UTC ©ECMWF Extreme foreca st index t+000-120 VT: Frida y 23 September 2011 00UTC - Wednesda y 28 September 2011 00UTC Surface: Tota I precipitation index



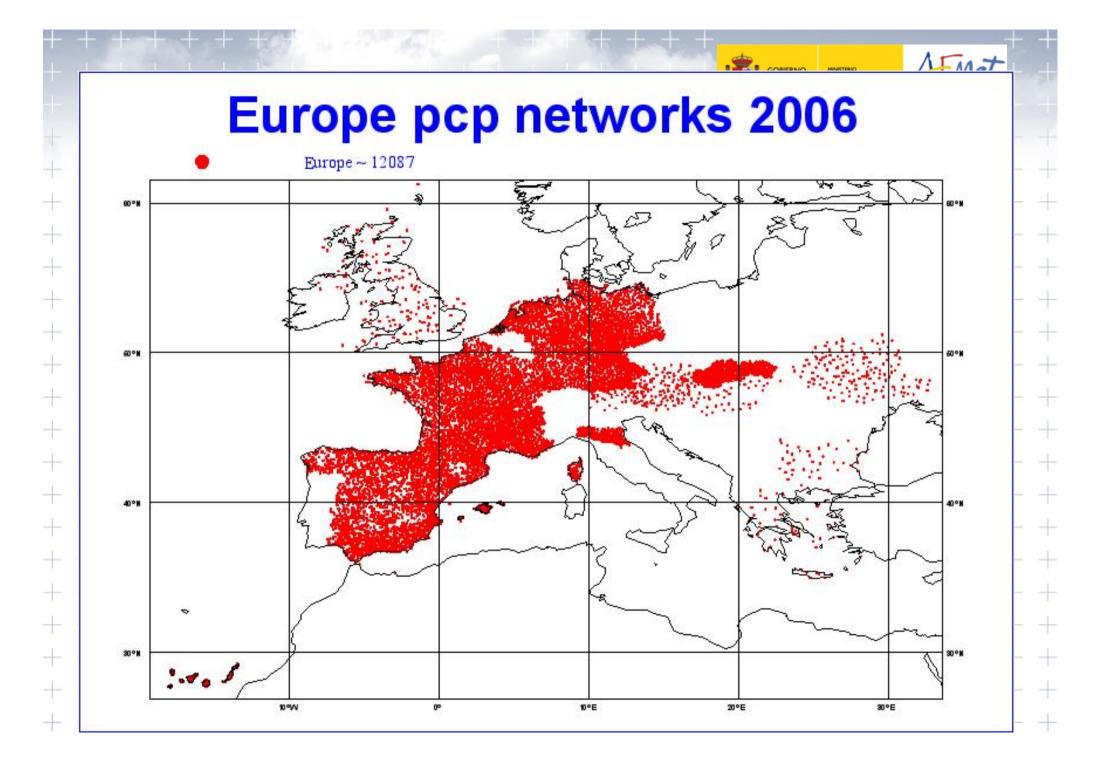
Short-Range – AEMET - SREPS

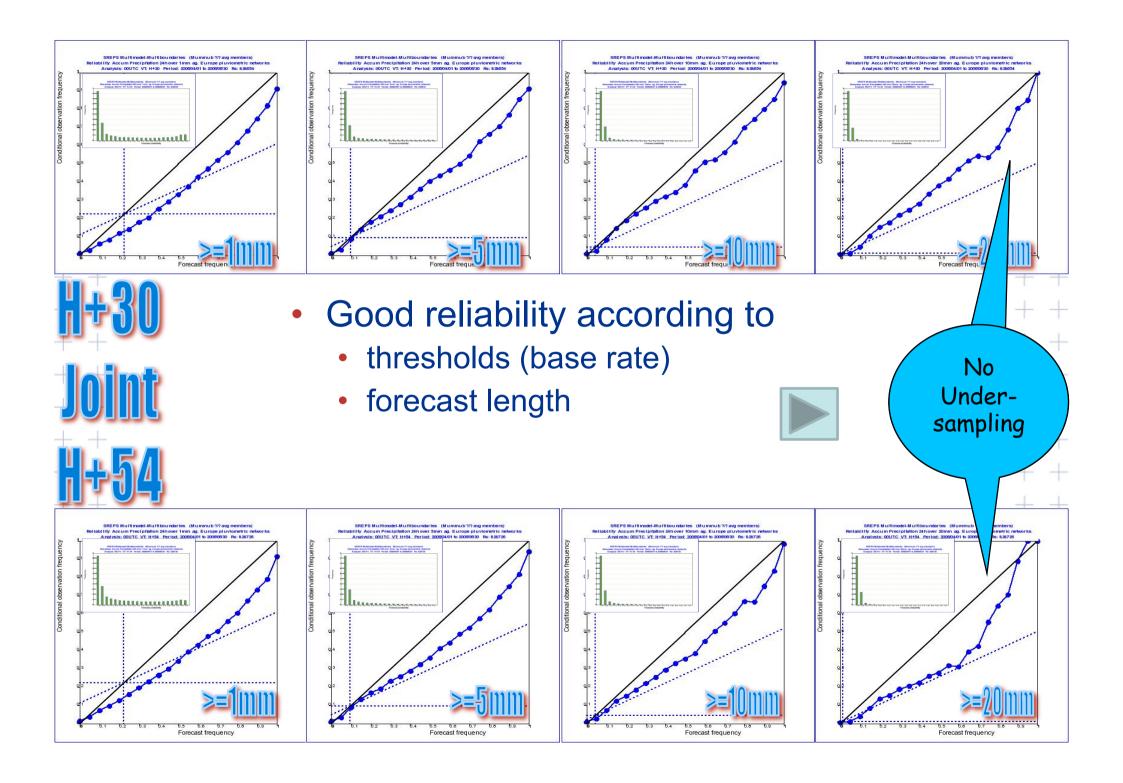
Characteristics:

• Initial and boundary condition perturbations: Downscaling Global Deterministic models (ECMWF, NCEP, CMC, JMA, GME).

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- Model errors: Multimodel (Hirlam, HRM, COSMO, UM, MM5)
- 25 members.
- ~ 25 Km horizontal resolution.
- Goal:
 - Forecasting severe weather at short-range.
- Tool:
 - Better spread-skill from multimodel technique.
 - Better PDF for precipitation.
 - Easy calibration through Bayesian Model Averaging (BMA).
- Disadvantage:
 - Difficult to maintain the system operationally (human resources





Comparison SREPS with ECMWF EPS

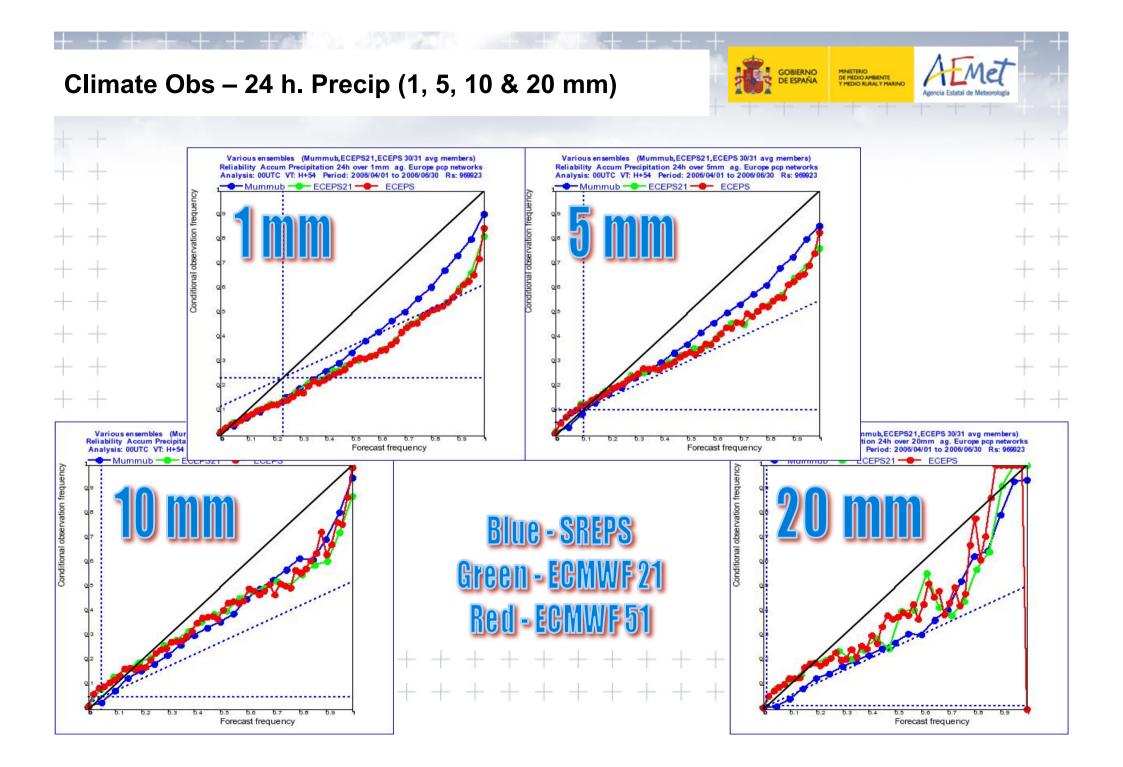
• Period: April to June 2006

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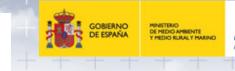
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- European Synop obs: H+72.
 - Mslp / v 10m / Precipitation
- European climate precipitation network: H +54 (longest SREPS period matching observations).
 - 24 hours accumulated precipitation (from early morning to early morning).

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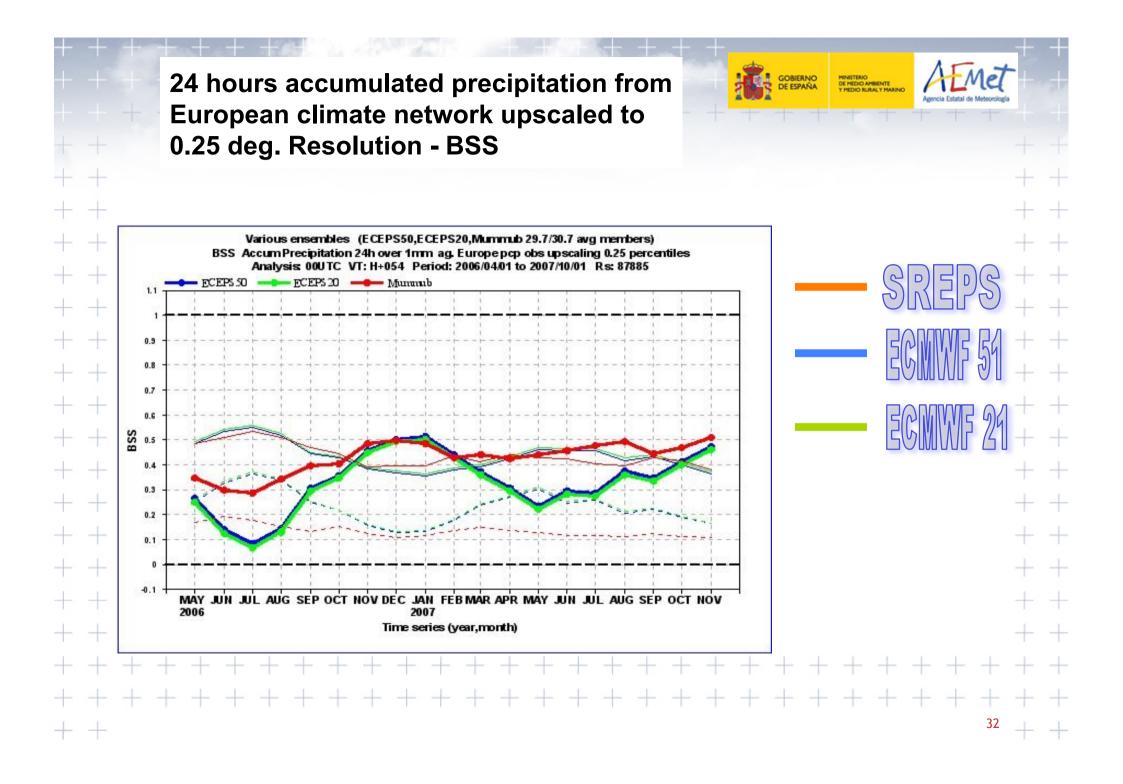


Climate Obs – 24 h. Precip (1, 5, 10 & 20 mm)



Brier Skill Score (BSS) Decomposition – 10⁶ realizations

+ $+$									-		-	+ +
+ +		Precip (mr	n) Climatol Frequei		Uncertainty		MumM	MumMub ECMWF 2		ECWMF	- 51	+ +
BSS (+)		1	0.24	0.24		0.35		5	0.28	0.28	3 -	+ $+$
	DITI	5	0.11		0.09		0.27	7	0.22	0.22	2 -	+ $+$
+ +		10	0.05	5	0.05		0.18	3	0.18	0.19	+ +	
+ $+$		20	0.01		0.01		0.01		0.07	30.0	3 –	+ +
+ $+$	Precip (mm)	MumMub	ECMWF 21		ECWMF 51						-	+ +
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+ +	10	0.03	0.03		0.03						-	+ +
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+ + + -	+ + + +	+ + +	+ + +	+	+ + +	+	+ +	+	+ $+$ $+$		24	+ +
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Time-Lagged Super-ensemble

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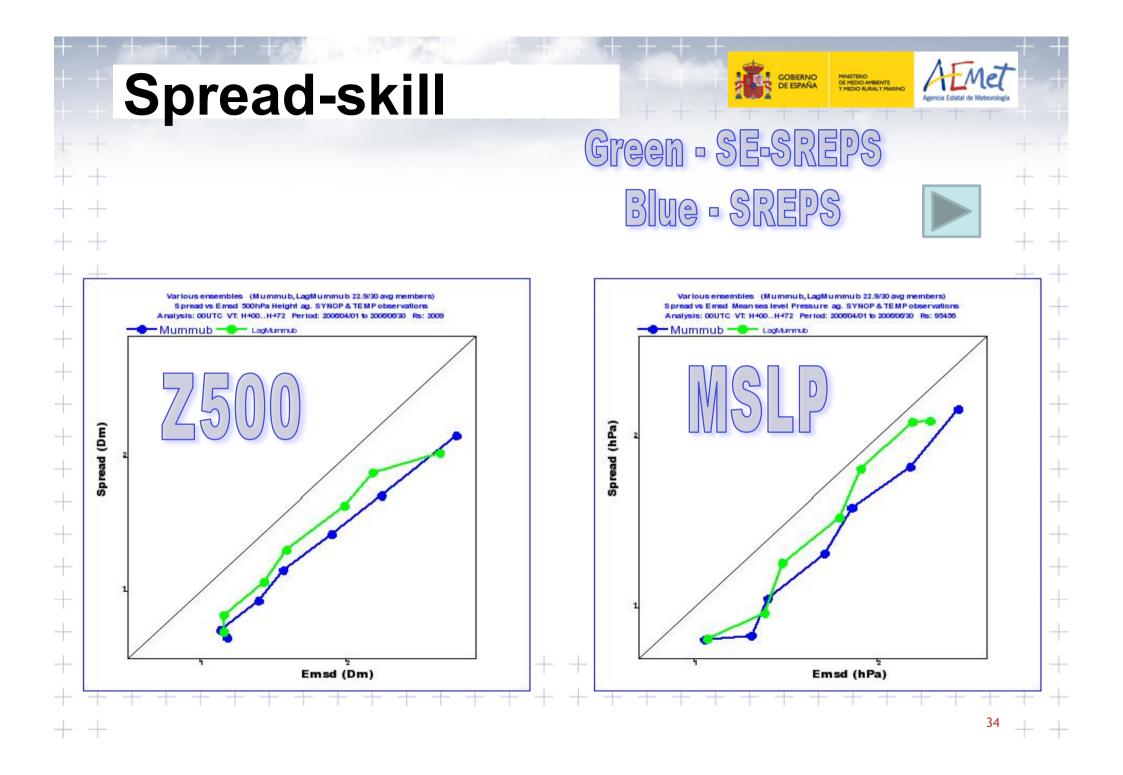
• How much predictability can be added by a timelagged super-ensemble?

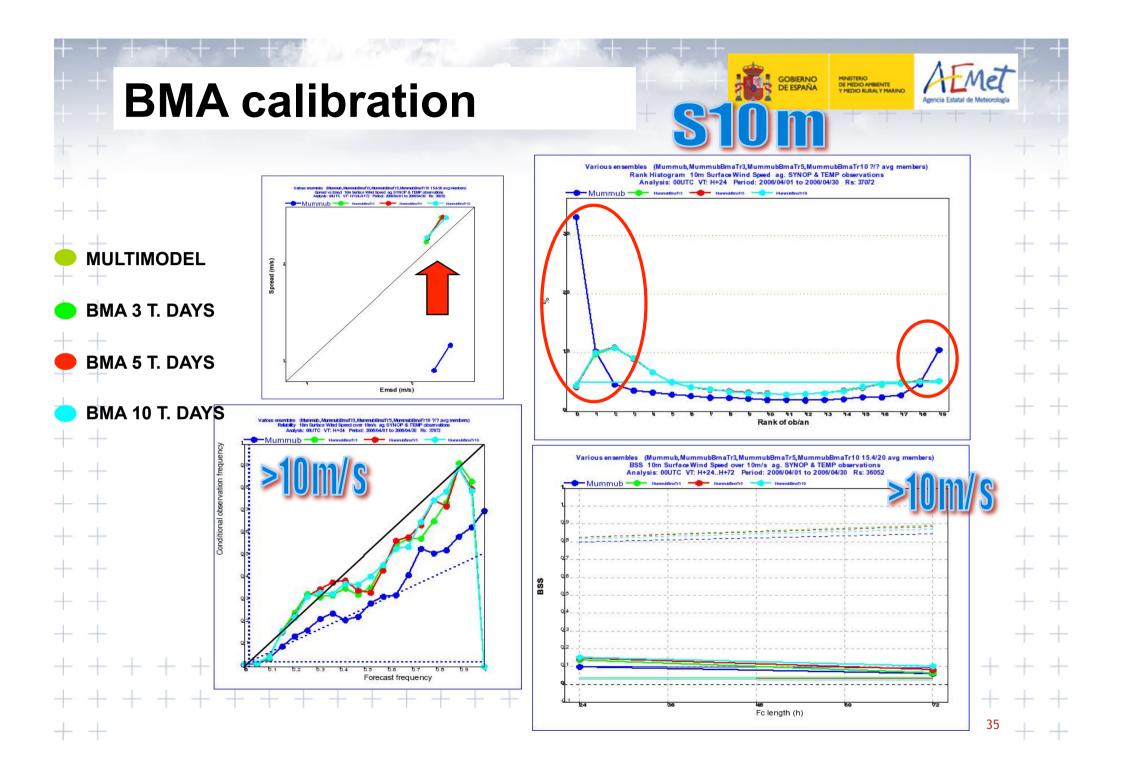
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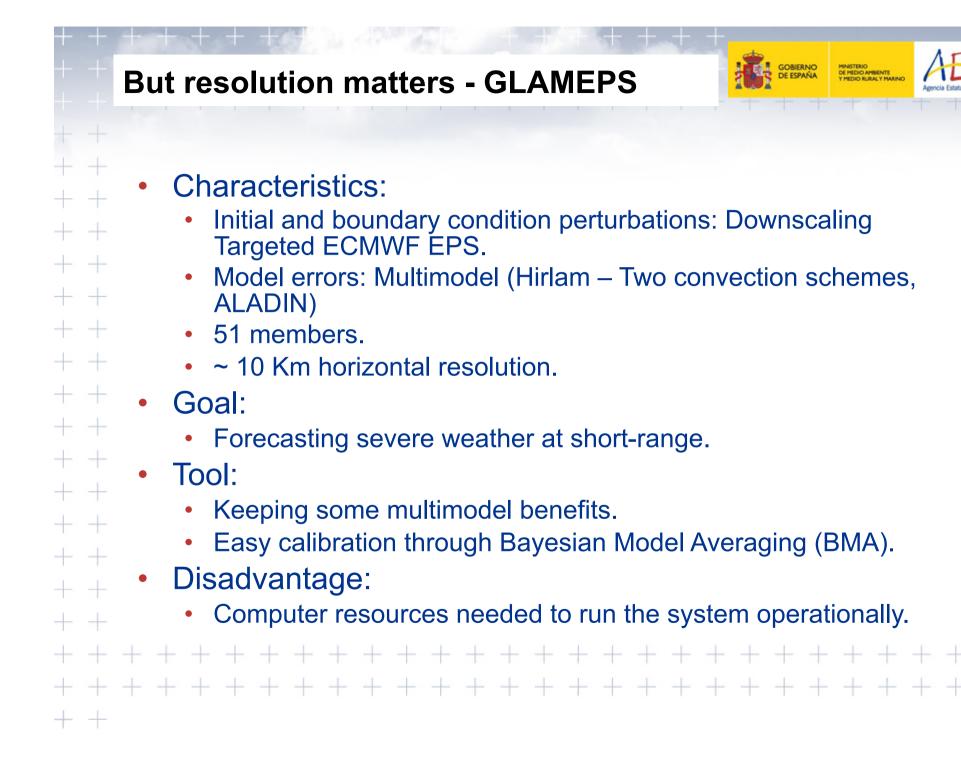
• 40 members super-ensemble (SE-SREPS) with the last two runs of SREPS (HH & HH-12).

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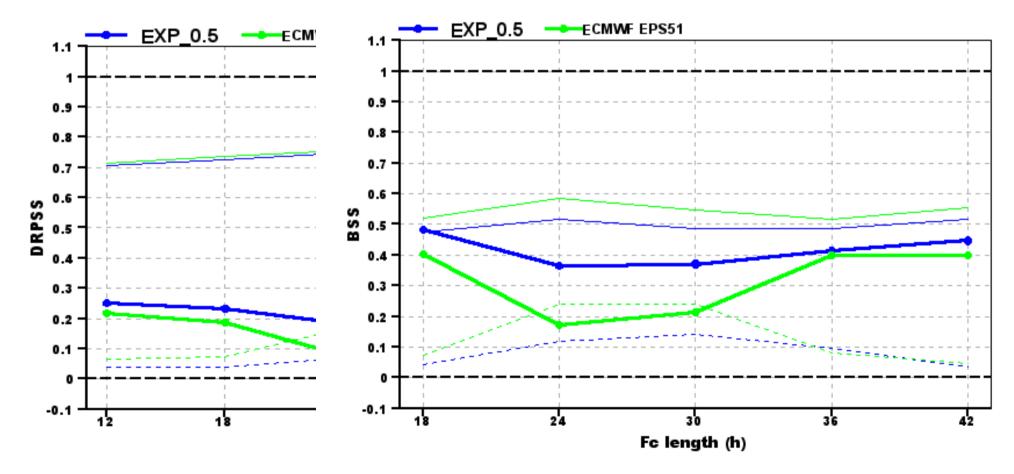
- Verification against observations
- Cheap in terms of computer resources
- Just a different post-process





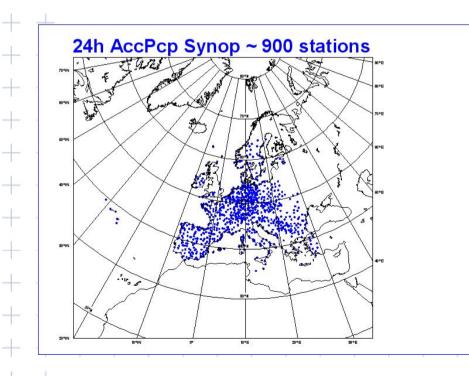




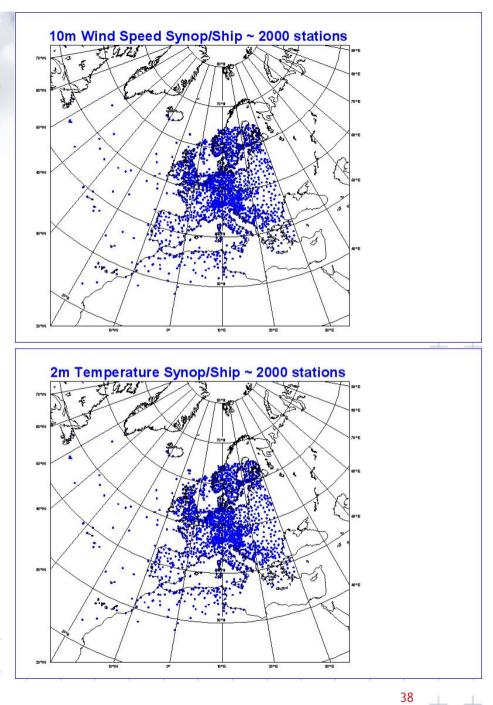


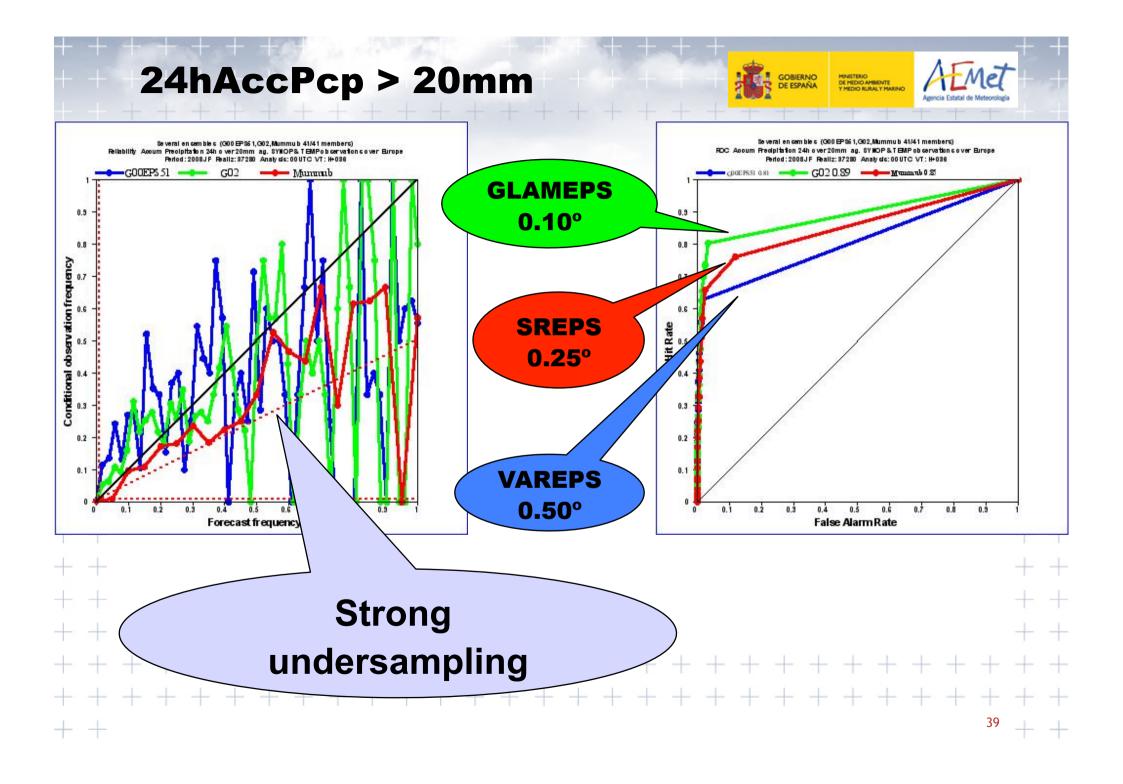
Observations

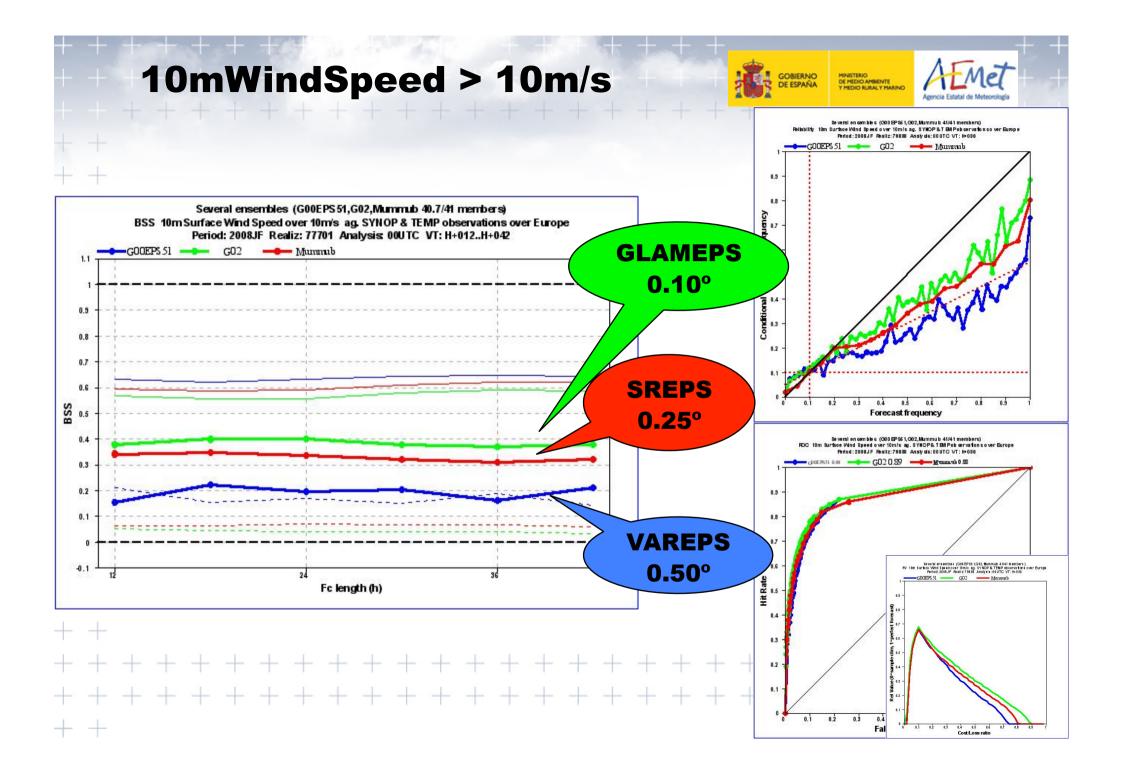
- Only available forecast steps 12,18,24,30,32,36,48 for GLAMEPS EXP_2.0
- Thus climatological network not feasible (6/to/30)
- SYNOP/SHIP available (pcp 18/to/36)

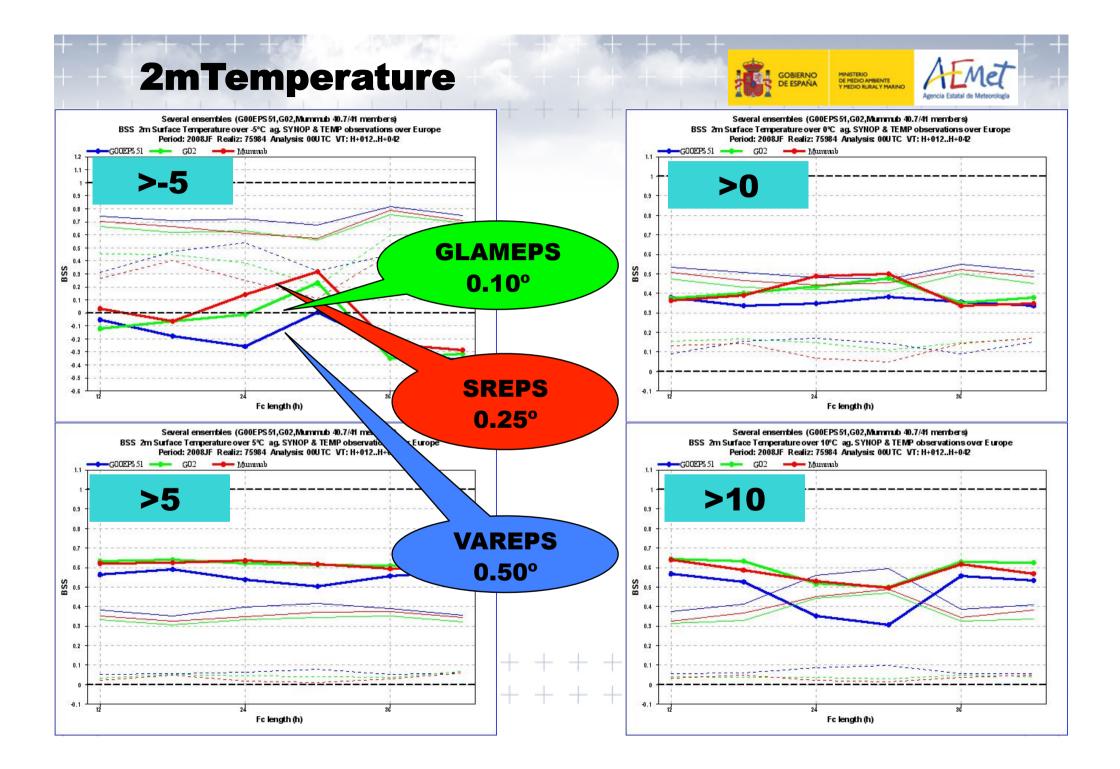


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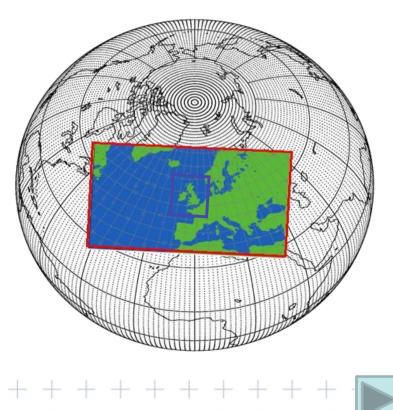


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	Μ	esoscale EPS	logia
+ + + + + + + +		 Characteristics: Initial and boundary condition perturbations: Downscaling lower resolution EPS or deterministic global models. Model errors, perturbations in Physics: Stochastic Physics Stochastic Physics 	+ + + + + + + + + + + + + + + + + + + +
+ +		 Stochastic parameters Multi-Physics 	+ +
+ +		 Domain: very small (normally one country). 15-20 members. 	+ +
+ $+$		 ~ 2 Km horizontal resolution. 	+ $+$
+ $+$		 Running 4 to 8 times a day up to 24 or 36 hours. 	+ $+$
+ $+$	•	Goal:	+ $+$
+ +	•	 Forecasting severe weather at short- and very short-range (nowcasting). Tool: 	+ +
+ +		Convective-permitting EPS.	+ +
+ +		 Using mesoscale NWP models. 	+ +
+ +	•	Disadvantage:	+ +
+ +		 Computer resources needed to run the system operationally are huge. 	+ +
+ +	+	Objective verification very difficult due to the high resolution.	• + +
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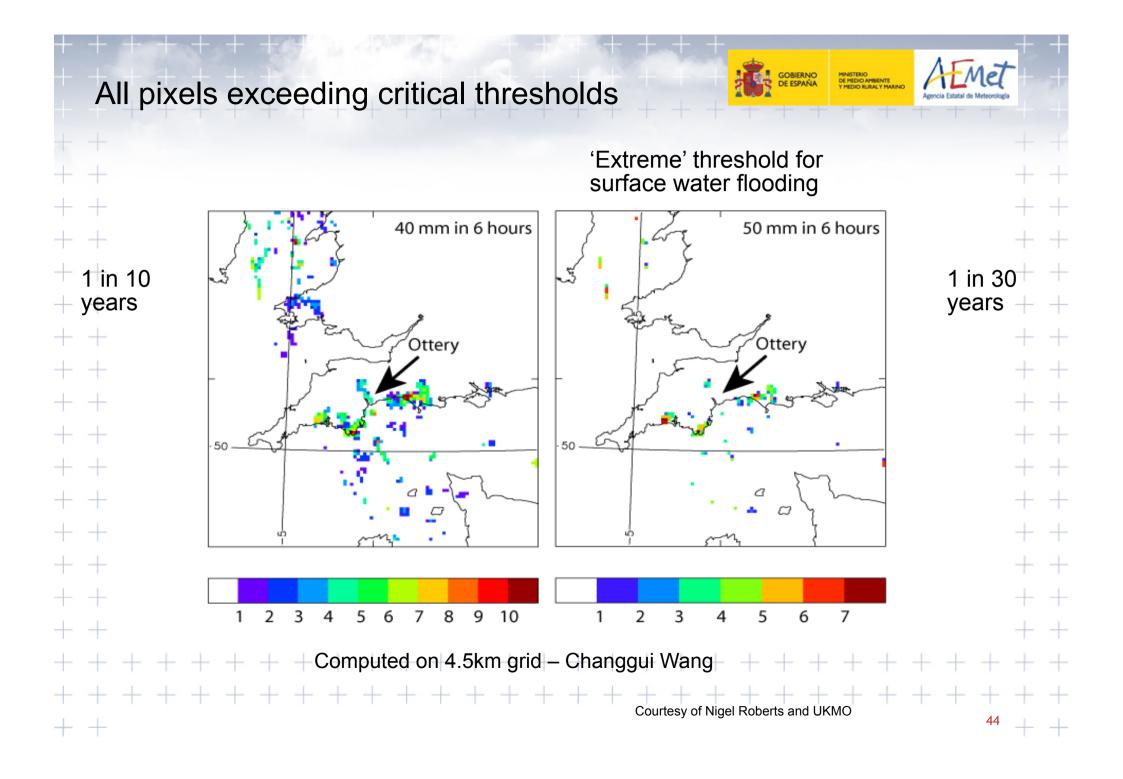
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- Plan to routinely run a 2.2 km ensemble from 2012 (MOGREPS-UK), embedded within MOGREPS-R (EU) (18 km -> 12 km) ensemble.
- 36-hour forecasts
- 12 members
 - 6-hour cycling
- Downscaling No highresolution initial perturbations or forecast perturbations to start with
- Case study experiments
- 24 members 1.5 & 2.2 km



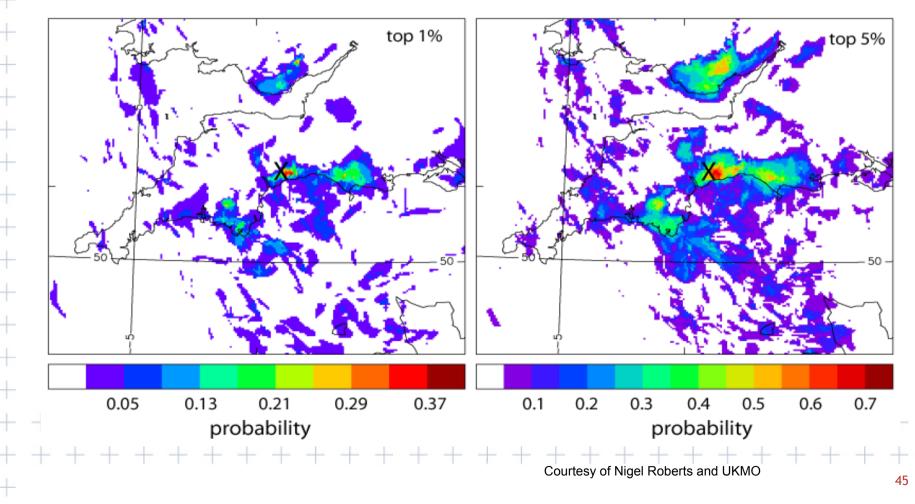
Courtesy of Nigel Roberts and UKMO

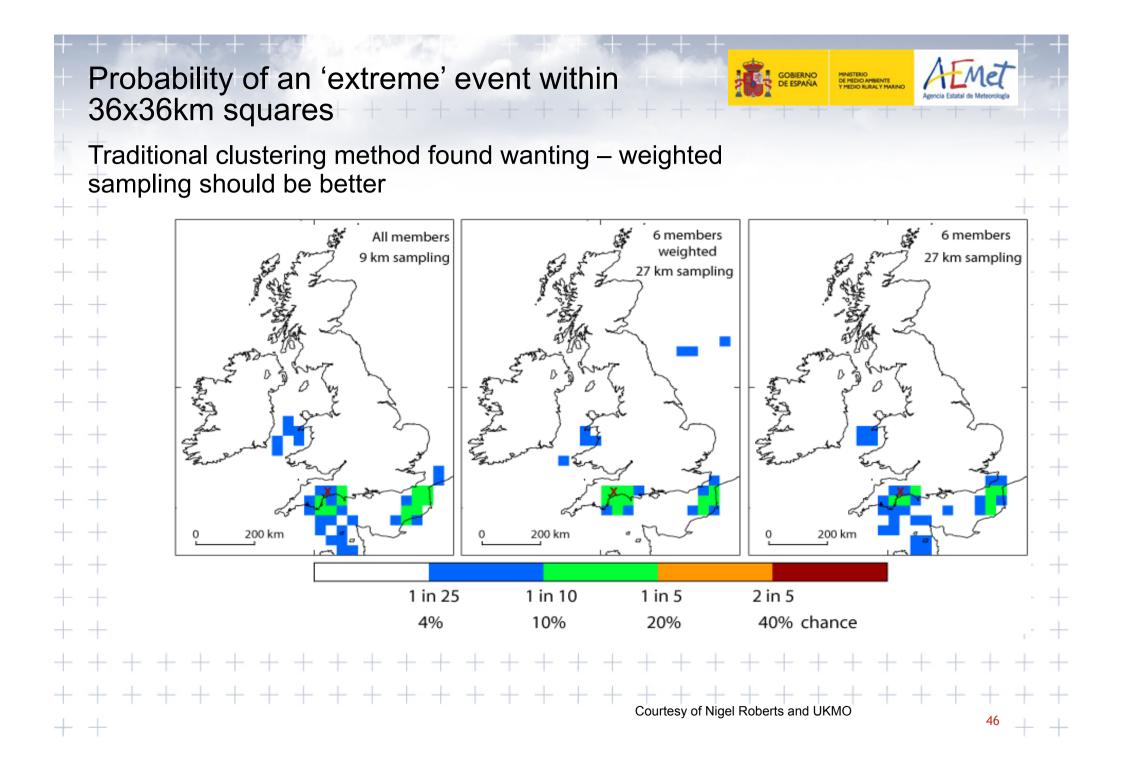


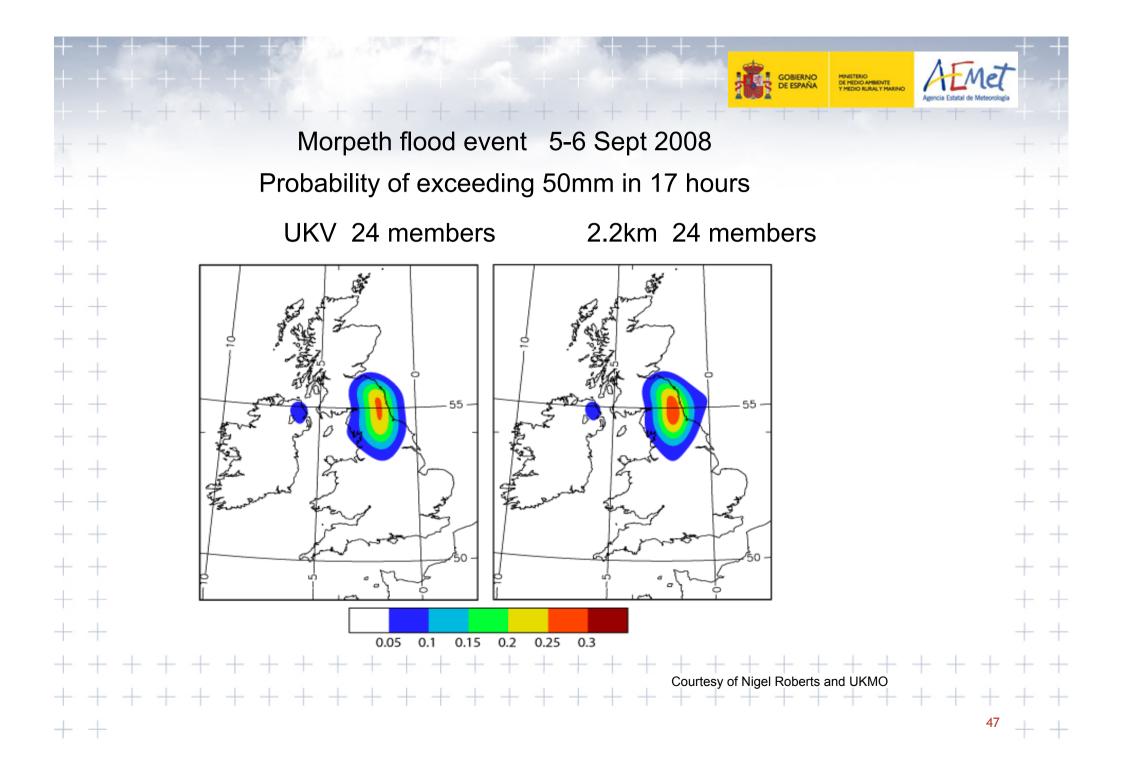
Ottery-St-Mary flood event

Probability of getting the top 1% or 5% of rainfall amounts. Peak values exceeded extreme rainfall thresholds. Produced from 24 forecasts from the 1.5 km UKV model. X marks Ottery.

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Mesoscale EPS – Example - DWD

- pre-operational phase has started: Dec 9th, 2010
- pre-operational setup:
 - 20 members
 - grid size: 2.8 km
 - convection-permitting
 - lead time: 0-21 hours,
 - 8 starts per day (00, 03, 06,... UTC)
 - variations in physics, initial conditions, lateral boundaries

Perturbation Methods

Lateral Boundaries

"multi-model"

driven by different global models

Courtesy of Susanne Theis and DWD

"multi-model"

Initial Conditions

different global models are used to modify COSMO-DE initial conditions

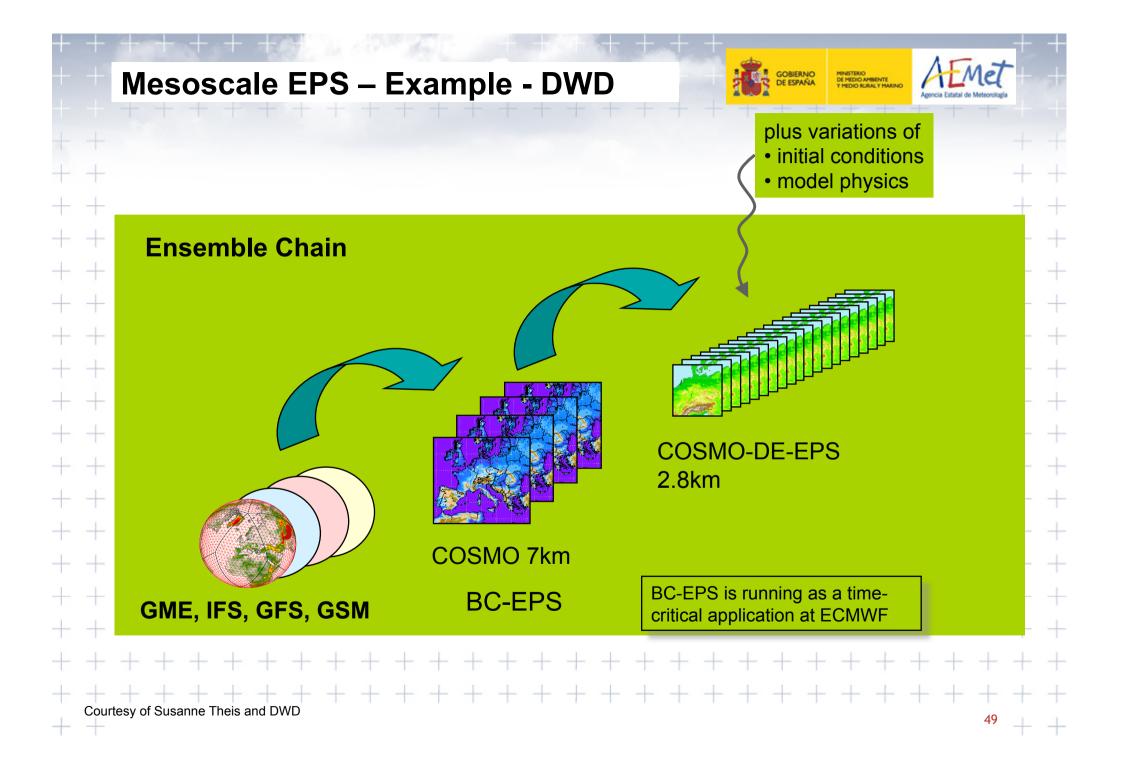
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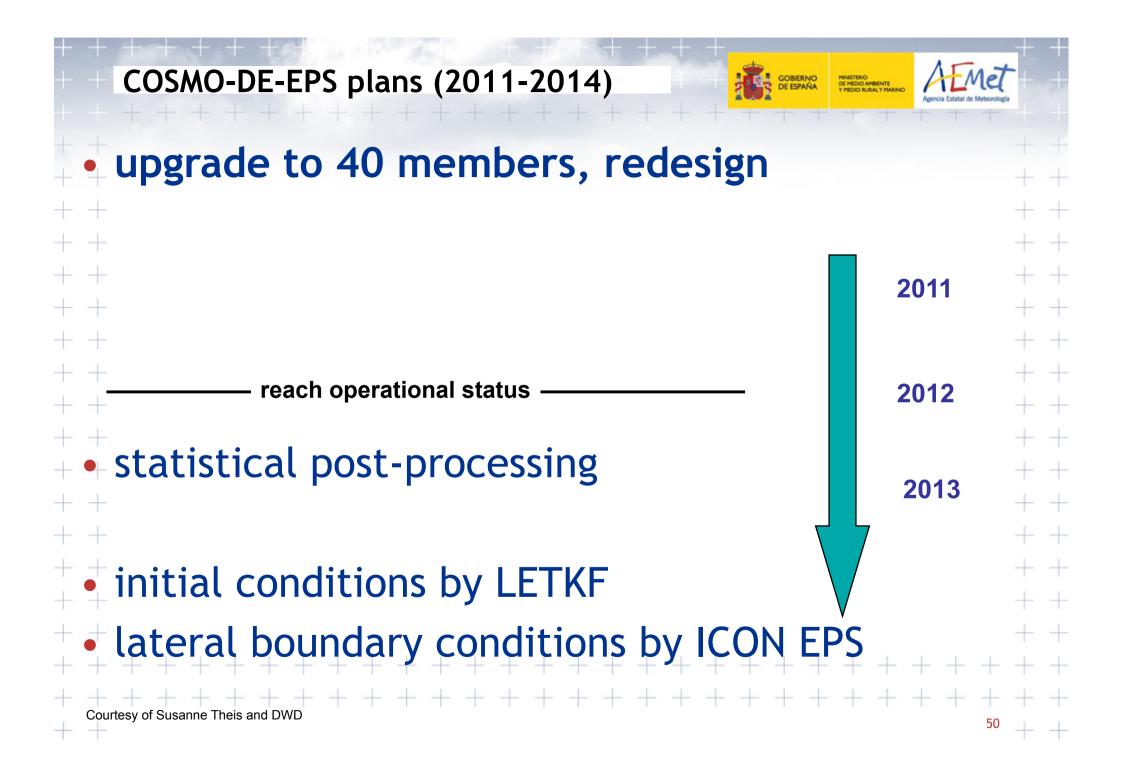
Model Physics

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"multi-configuration"

different configurations of the COSMO-DE model





The "Supercell Example"

- COSMO-DE: convection-permitting model (2.8 km)
- can explicitly simulate severe storms,
 but deterministic forecasts of individual cells
 are not possible with 12 h lead time
- i.e. the **model provides a possible scenario** for the development of individual convective cells
- in this example: visualized by
 - simulated radar reflectivity
 - the supercell detection index (SDI) Wicker et al. (2005)

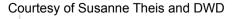
by Axel Seifert

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with Thomas Hanisch, Christoph Gebhardt, Zied Ben Bouallegue, Michael Buchold +

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Deutscher Wetterdienst



The "Supercell Example"

21 May 2009

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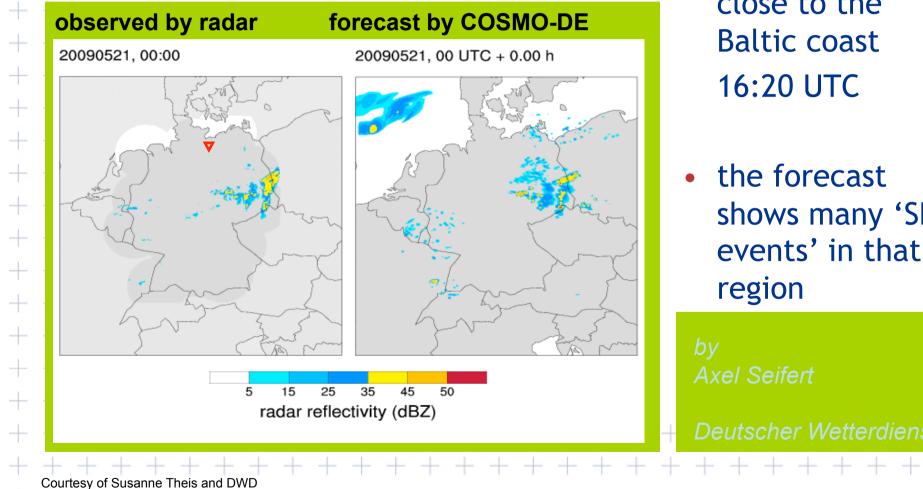
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F2 tornado V near "Plate" close to the Baltic coast 16:20 UTC the forecast shows many 'SDI

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The "Supercell Example"

21 May 2009

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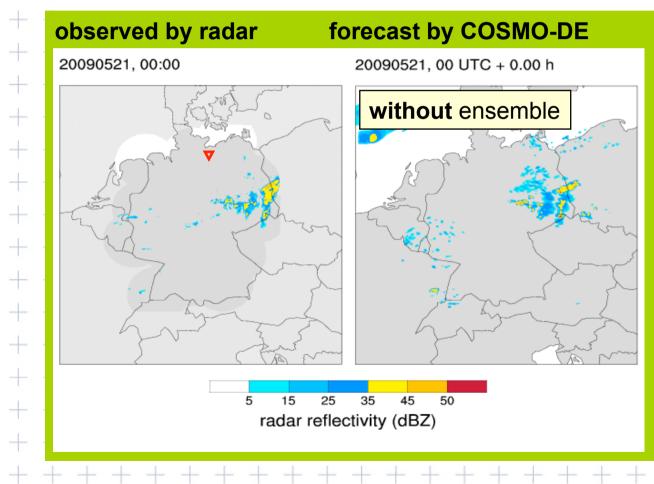
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 F2 tornado near "Plate" close to the **Baltic coast** 16:20 UTC

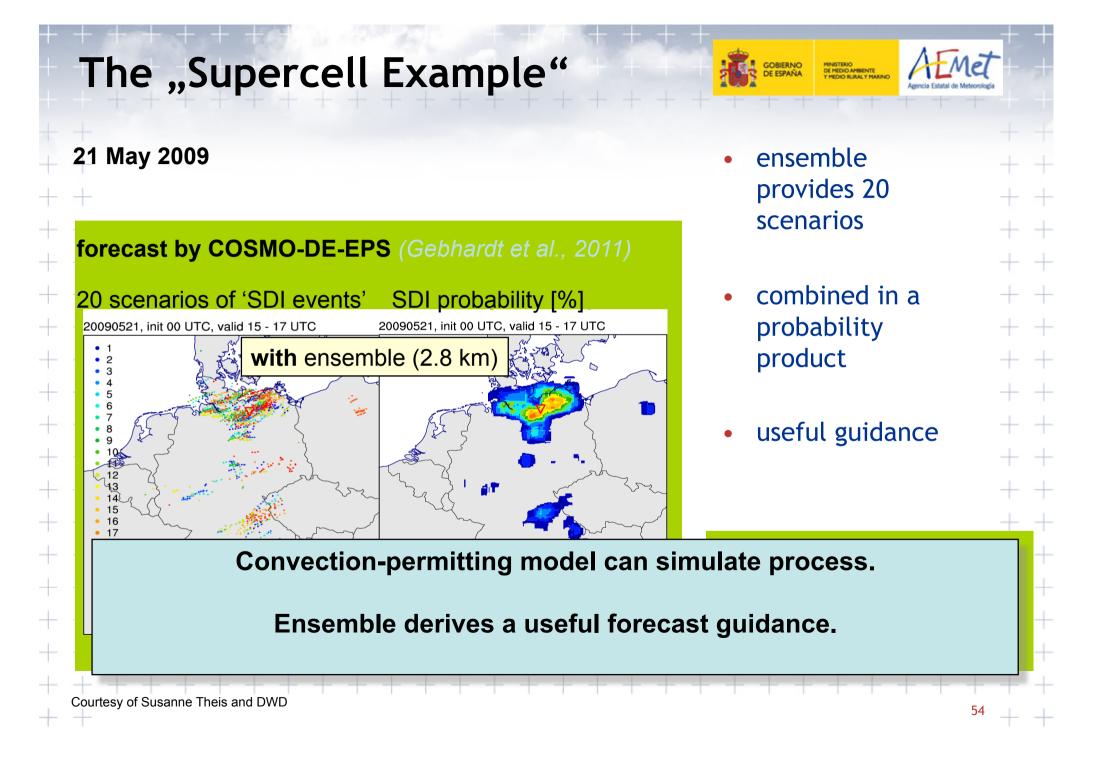
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the forecast shows many 'SDI events' in that region

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Courtesy of Susanne Theis and DWD



HWT	oscale EPS – Example – CAPS – SPC Spring Experiment (http://hwt.nssl.noaa.gov/ g_2011/index.php)	50
• • • • • • •	 Characteristics: Initial condition perturbations: EDA using radar Boundary condition perturbations: downscaling from SREF. Model errors, perturbations in Physics: Multimodel (WRF/NMM, WRF/ARW, ARPS) Multi-Physics Domain: CONUS 50 members. ~ 4 Km horizontal resolution. Running 00 UTC up to 36 hours. 	+++++++++++++++++++++++++++++++++++++++
+ + + +	 Forecasting severe weather at short- and very short-range (nowcasting): Severe convection. Convective initiation. QPF Tool: Convective-scale EPS. 	+ + + + -
+	 Using mesoscale NWP models (WRF and ARPS). 	++
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Forecast Configurations of Three Years

Spring 2007: 10-member WRF-ARW, 4 km, 33 h, 21Z start
 time, NAM+SREF ICs. 5 members physics perturbations only, 5
 with Phy+IC+LBC perturbations. Single 2 km grid. 2/3 CONUS
 (Xue et al.; Kong et al.; 2007 NWP conf.)

Spring 2008: larger domain, 00Z start, Phy+IC+LBC pert for
 all. Radar Vr and Z data assimilation for 4 and 2 km grids!
 (Xue et al.; Kong et al. 2008 SLS Conf.)

Spring 2009: 20 members, 4 km, 3 models (ARW, NMM, ARPS), mixed physics/IC/LBCs. +Single 1 km grid. Radar DA (3DVAR +cloud analysis) on native grids. 30 h forecasts from 0Z (Xue et al.; Kong et al. 2009 NWP Conf.)

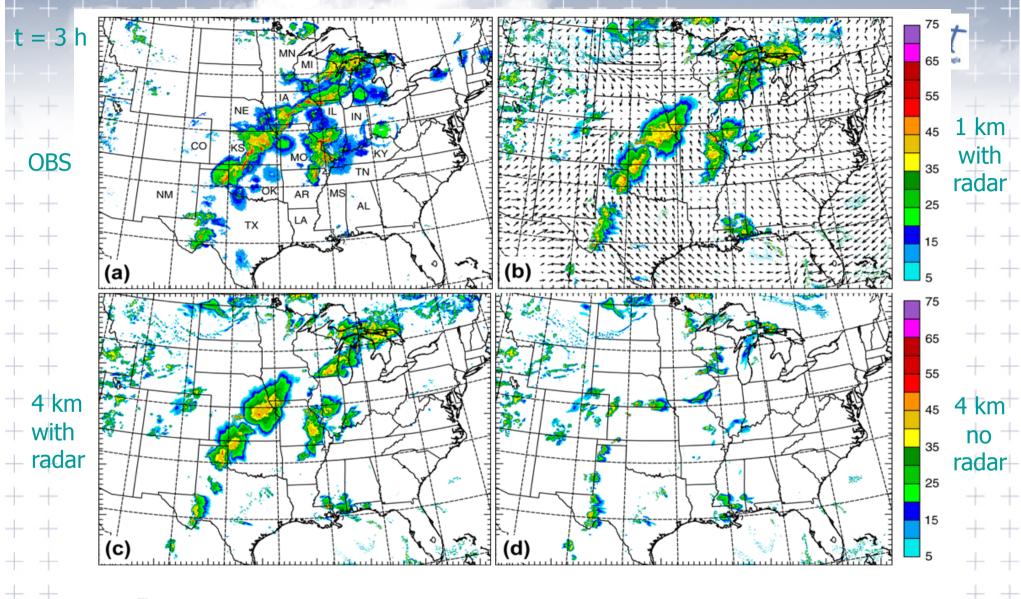
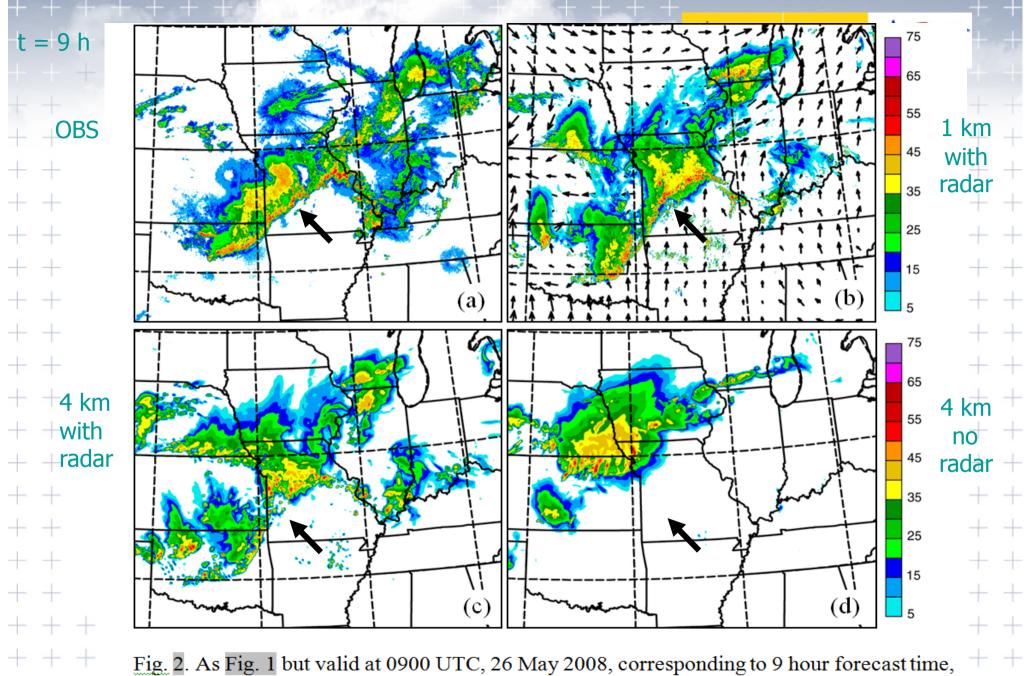
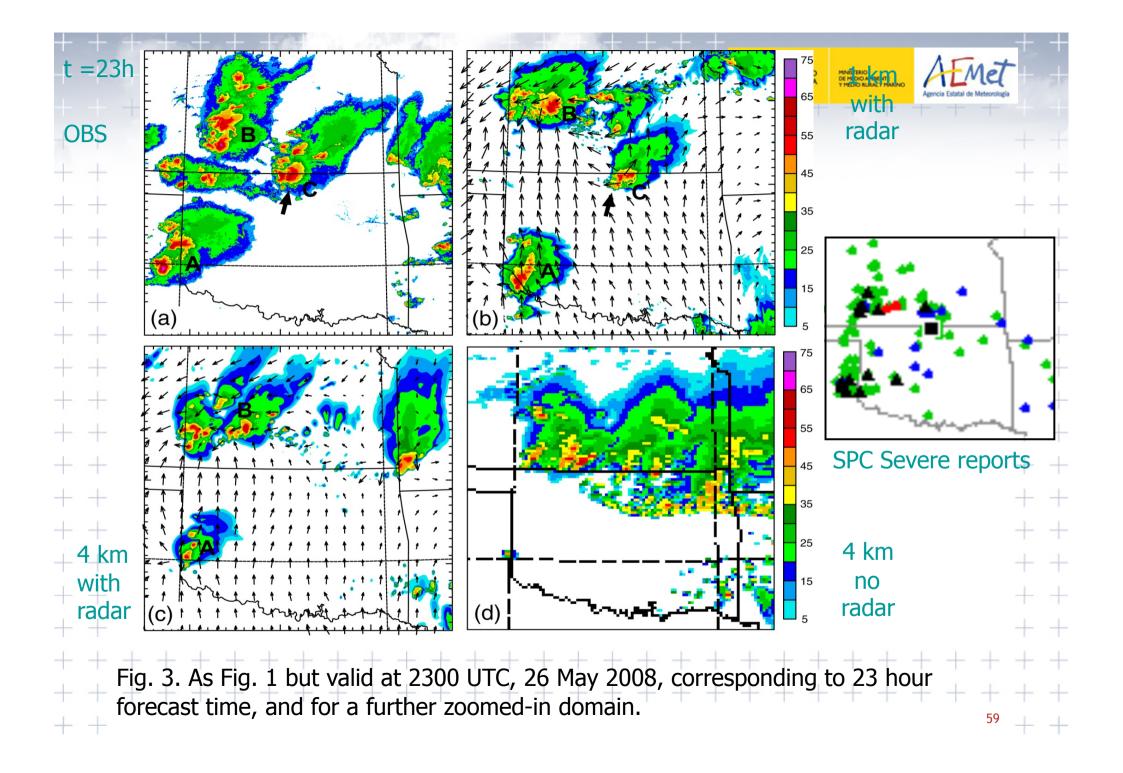


Fig. 1. Observed composite radar reflectivity (a), and 3-hour forecasts of the same field valid at 0300 UTC, May 26, 200, from (b) the 1-km forecast with radar data assimilation, (c) 4-km control forecast with radar data assimilation, and (d) 4-km forecast without radar data. For forecast domain is shown. May 26, 2008 case



and for a zoomed-in domain.

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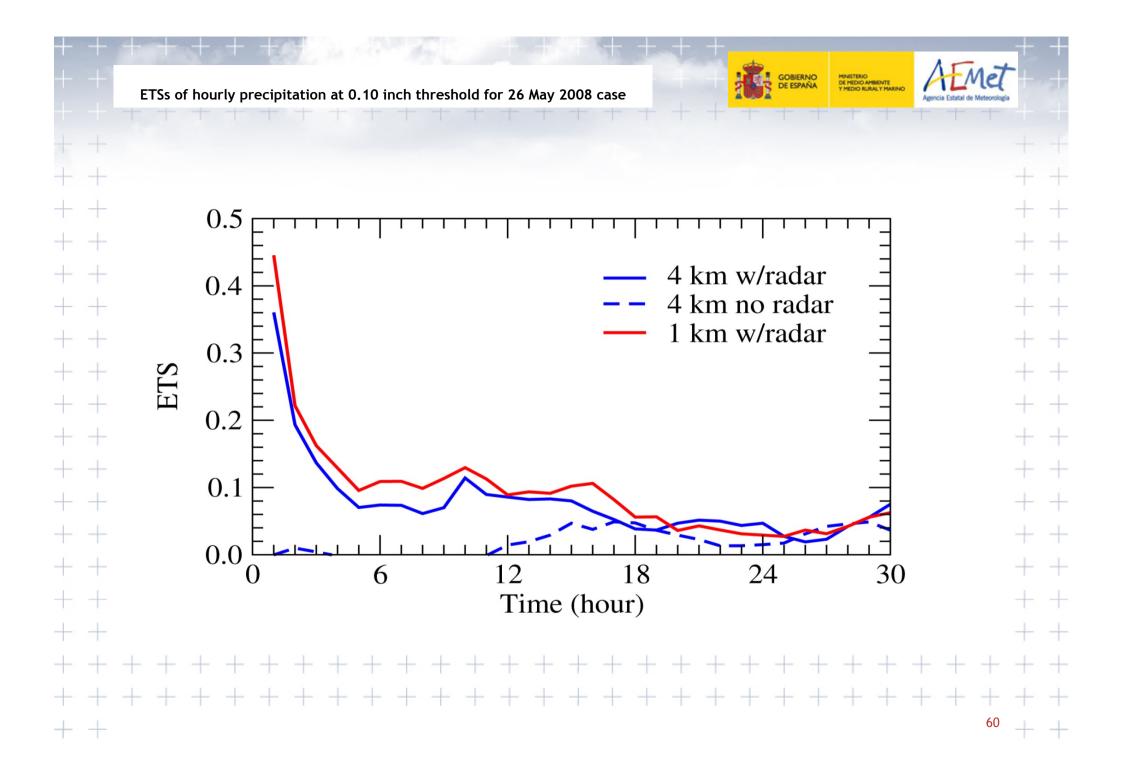


 Table 1. Configurations of the ARW members of 4-km ensemble. NAMa and NAMf refer to 12 km NAM analysis and forecast, respectively. ARPSa refers to ARPS 3DVAR analysis.

member	IC	LBC	Radar	MPhys	SWRad	LSM	PBL
arw_cn	00Z ARPSa	00Z NAMf	ves	Thompson	Goddard	Noah	MYJ
arw_c0	00Z NAMa	00Z NAMf	no	Thompson	Goddard	Noah	MYJ
arw_n1	arw_cn – em_pert	SREF em-n1	yes	Ferrier	Goddard	Noah	YSU
arw_p1	arw_en + em_pert	SREF em-p1	yes	WSM6	Dudhia	Noah	MYJ
arw_n2	arw_en – nmm_pert	SREF nmm-n1	yes	Thompson	Dudhia	RUC	MYJ
arw_p2	arw_en + nmm_pert	SREF nmm-p1	yes	WSM6	Dudhia	Noah	YSU
arw_n3	arw_en – etaKF_pert	SREF etaKF-n1	yes	Thompson	Dudhia	Noah	YSU
arw_p3	arw_en + etaKF_pert	SREF etaKF-p1	yes	Ferrier	Dudhia	Noah	MYJ
arw_n4	arw_cn – etaBMJ_pert	SREF etaBMJ-n1	yes	WSM6	Goddard	Noah	MYJ
arw p4	arw cn + etaBMJ pert	SREF etaBMJ-p1	yes	Thompson	Goddard	RUC	YSU

* For all members: long wave radiation = RRTM; cumulus parameterization = None

Table 2. Configurations for NMM members of the 4-km ensemble

member	IC	LBC	Radar	MPhys	LWRad	SWRad	LSM	PBL
nmm_en	00Z ARPSa	00Z NAMf	ves	Ferrier	GFDL	GFDL	Noah	MYJ
nmm_c0	00Z NAMa	00Z NAMf	no	Ferrier	GFDL	GFDL	Noah	MYJ
nmm_n1	nmm_cn – em_pert	SREF em-n1	yes	Thompson	RRTM	Dudhia	Noah	MYJ
nmm_p1	nmm_en + em_pert	SREF em-p1	yes	WSM6	GFDL	GFDL	RUC	MYJ
nmm_n2	nmm_en – nmm_pert	SREF nmm-n1	yes	Ferrier	RRTM	Dudhia	Noah	YSU
nmm_p2	nmm_cn + nmm_pert	SREF nmm-p1	yes	Thompson	GFDL	GFDL	RUC	YSU
nmm_n3	nmm_en – etaKF_pert	SREF etaKF-n1	yes	WSM6	RRTM	Dudhia	Noah	YSU
nmm_p3	nmm_cn + etaKF_pert	SREF etaKF-p1	yes	Thompson	RRTM	Dudhia	RUC	MYJ
nmm_n4	nmm_cn - etaBMJ_pert	SREF etaBMJ-n1	yes	WSM6	RRTM	Dudhia	RUC	MYJ
nmm_p4	nmm_cn + etaBMJ_pert	SREF etaBMJ-p1	yes	Ferrier	RRTM	Dudhia	RUC	YSU

* For all members: cumulus parameterization = None. nmm_n1 and nmm_p3 (shaded) were removed from the list after the first week of experiment because they took too long to complete, reducing the NMM ensemble size from 10 to 8.

	member	IC	LBC	Radar	MPhys	LWRad	SWRad	LSM	PBL	SGS turb
)	arps_cn	00Z ARPSa	00Z NAMf	ves	Lin	Goddard	Goddard	2-layer	TKE	3D TKE
-	arps_c0	00Z NAMa	00Z NAMf	no	Lin	Goddard	Goddard	2-layer	TKE	3D TKE

* For all members: cumulus parameterization = None

ARW

NMM

ARPS

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Future: A Dream System of Convective-scale NWP (from Dr. Xue - CAPS)

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- Ensemble Kalman filter DA every 5 minutes at ~1 km resolution;
- + +• ~1 km ensemble forecasts launched every ~30 min up to 6
 + + hours;
 + +
 - Reduced (~4 km) resolution ensemble forecasts up to 72
 hours;
 - Deterministic forecasts from ensemble mean analyses at up to 250 m resolution; and at reduced resolutions beyond 6 hours;
 - Explicit forecasts from MCS down to tornado vortex scales, with probability estimates.
 - An NSF sustained-petaflops machine (IBM Power7) with over 200,000 cores to come online in 2011 - are we ready?

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Conclusions

 Mesoscale NWP models are able to replicate severe weather events (SWE).

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- +• But model errors grow faster at higher resolutions.
- Uncertainty of Mesoscale NWP models and predictability of SWE make very difficult to use a deterministic approach.
- Phase errors can make deterministic information useless.
- +• EPS and probabilistic tools are useful to improve the forecast
 + of SWE.
- Increasing resolution improves EPS results.
- Although computer resources involved in mesoscale EPS are huge, this tool will become very important in the coming future in the SWE forecasting process.

