

Ensemble Prediction System in NCMRWF: its performance and future goals

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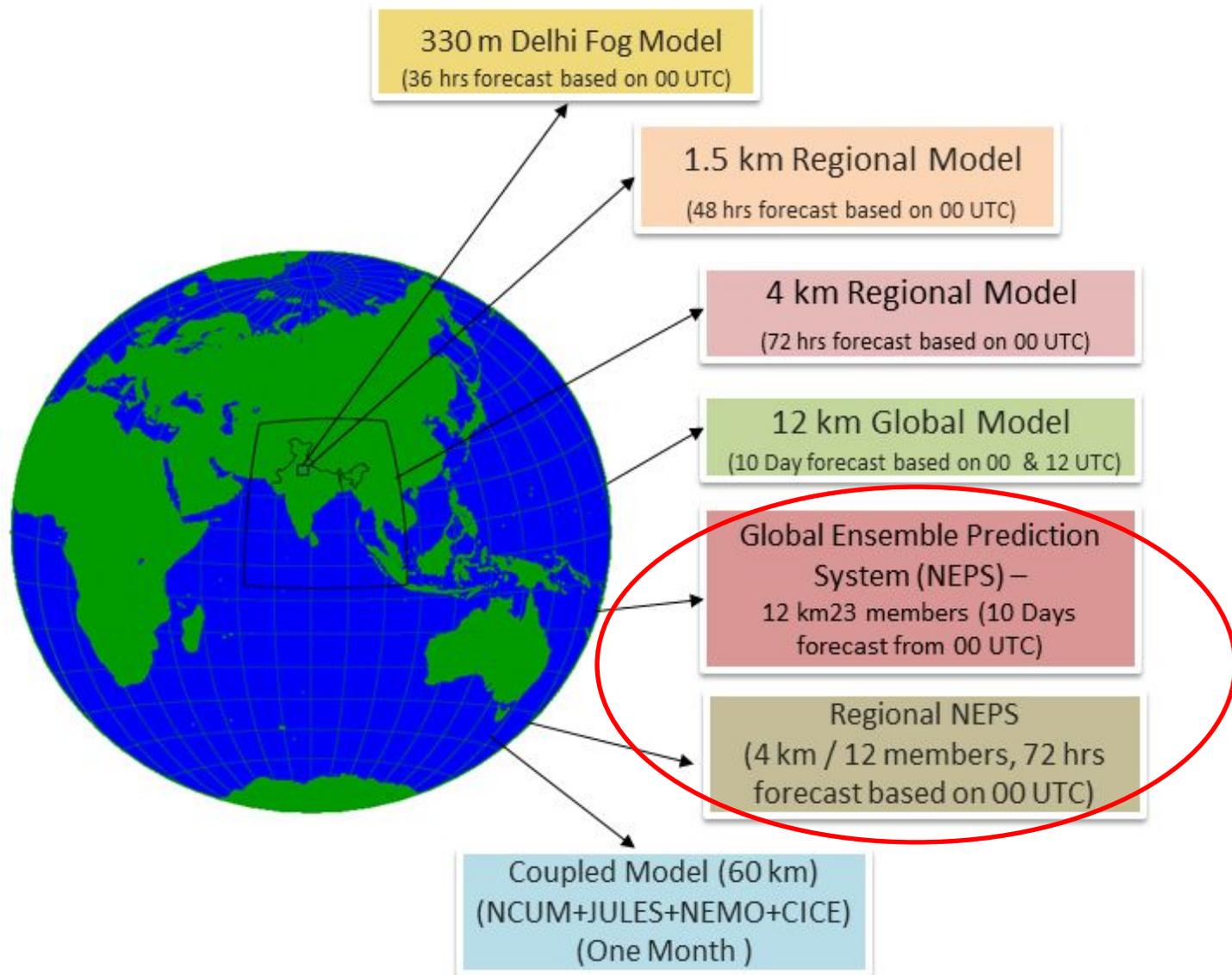
9th NOAA ENSEMBLE USERS WORKSHOP, 22–24 August 2023,
23 August, Session 5b



Schematic representing a seamless modelling system operational at NCMRWF



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Details of the NCUM Assimilation-Forecast system (NCUM-G)



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Model	Atmospheric Data Assimilation	Surface analysis
<p>Model: Unified Model; Version 11.2</p> <p>Domain: Global</p> <p>Resolution: 12 km, Levels 70 (Top of the model: 80 km)</p> <p>Grid: 2048x1536</p> <p>Time Step: 5 minutes</p> <p>Physical Parametrizations: Based on GA7.2</p> <p>Dynamical Core: ENDGame</p> <p>Forecast length: 10 days (forecasts are produced based on 00 UTC and 12 UTC initial conditions)</p>	<p>Resolution: N320L70 (~40 km) with N144L70 Hessian based pre-conditioning</p> <p>Method: Hybrid 4D-Var. Information on “errors of the day” is provided by NEPS ensemble forecasts at every data assimilation cycle</p> <p>Data Assimilation Cycles: 4 analyses per day at 00, 06, 12 and 18 UTC are produced. Observations within +/- 3 hrs from the cycle time is assimilated in the respective DA cycle</p> <p>Observations: List of observations assimilated are given in Table</p>	<p>Soil Moisture analysis: <i>Method:</i> Extended Kalman Filter <i>Analysis time:</i> 00, 06, 12 and 18 UTC <i>Observations assimilated:</i> ASCAT soil wetness observations, Screen Temperature and Humidity (pseudo observations from 3D-Var screen analysis)</p> <p>SST: Updated at 12 UTC DA cycle with OSTIA based SST and sea-ice analysis</p> <p>Snow Analysis: Satellite-derived snow analysis. Updated at 12 UTC DA cycle</p>



Observations Assimilated in Global Data Assimilation System



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Observation Type	Observation Description	Assimilated Variables
AHIClear	Advanced Himawari Imager radiances from Himawari-8	Brightness Temperature (T_b)
ABIClear	Advanced Baseline Imager radiances from GOES third generation satellites	T_b
Aircraft	Upper-air wind and temperature from aircraft	u, v, T
AIRS	Atmospheric Infrared Sounder of MODIS	T_b
AMSR	Radiances from AMSR-2 onboard GCOM-W1 satellite	T_b
ATOVS	AMSU-A (including cloud affected radiances), AMSU-B/MHS from NOAA-18 &19, MetOp-B&C	T_b
ATMS	Advanced Technology Microwave Sounder in NPP& NOAA20 satellites	T_b
CrIS	Cross-track Infrared Sensor observations in NPP&NOAA20 satellites	T_b
MWHS	MicoWave Humidity Sounder onboard FY3C and FY3D	T_b
MWTS	MicroWave Temperature Sounder onboard FY3D	T_b
MWRI	MicroWave Radiation Imager onboard FY3D	T_b
GMI	Global Precipitation Measurement (GPM) Microwave Imager (GMI) instrument	T_b
GPSRO	Global Positioning System Radio Occultation observations from various satellites	Bending Angle
GroundGPS	Ground based GPS observations from various locations	Zenith Total Delay
IASI	Infrared Atmospheric Sounding Interferometer from MetOp- B&C	T_b
IN3DImgr	INSAT-3D Imager Radiances	T_b
Satwind	Atmospheric Motion Vectors from various geostationary and polar orbiting satellites (including INSAT-3D& INSAT-3DR)	u, v
Scatwind	Advanced Scatterometer in MetOp-B & C	u, v
SEVIRIClear	Cloud clear observations from SEVIRI onboard Meteosat Prime and Indian Ocean Data Coverage (IODC) services	T_b
Sonde	Radiosonde (TAC & BUFR),Pilot balloons, Wind profiles	u, v, T, q
Surface	Surface observations over Land and Ocean (TAC & BUFR), TC bogus (Surface Pressure)	u, v, T, q, P_s
SSMIS	SSMIS Radiances	T_b



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NCMRWF Global Ensemble Prediction System (NEPS-G)



Present Operational EPS in NCMRWF (NEPS-G)



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Horizontal grid resolution	~ 12km (N1024e)
Initial perturbation strategy	Ensemble Transform Kalman Filter (ETKF)
Surface Perturbations	Sea Surface Temperature
Physics Perturbation method	Stochastic Perturbation of Tendencies (SPT), Stochastic Kinetic Energy Backscattering (SKEB)
Data assimilation method for control analysis	Hybrid 4D-Var
Members	<p>Forecast perturbations from 6 hr short forecasts, are based on 22 perturbed ensemble members and each of those are updated by the ETKF four times a day (0000, 0600, 1200 and 1800 UTC).</p> <p>Ten days long forecast provided by NEPS-G at 00 UTC is the combination of 11 members from 00 UTC cycle and lagged 11 members from 12 UTC cycle. 22 members (00UTC+12UTC)</p>

2020 NEPS Configuration that is based on PS42 with UM11.2 of UK metoffice



Medium-range global ensemble prediction system at 12 km horizontal resolution and its preliminary validation

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Abstract

Forecasts of high-impact weather systems require sufficiently high resolution of state-of-the-art numerical models in order to resolve the small-scale features. At the National Centre for Medium Range Weather Forecasting (NCMRWF) in India, a global ensemble prediction system (EPS—called the NEPS) has been implemented operationally at 12 km horizontal grid size. The NEPS configuration is based on the UK Met Office Global and Regional Ensemble Prediction System (MOGREPS). Initial condition perturbations are generated by the ensemble transform Kalman filter (ETKF) method. Model uncertainties are taken care of by stochastic kinetic energy backscatter (SKEB) and random parameters (RP) schemes. Forecast perturbations obtained from 6 hr short forecasts of 22 ensemble members are updated by the ETKF four times a day (0000, 0600, 1200 and 1800 UTC). Perturbations of surface parameters such as sea-surface temperature, soil moisture content and soil temperature are also included in the new NEPS. The NEPS aims to provide 10 day probabilistic long forecasts using 23 ensemble members (22 perturbed plus one control). The long forecast provided at 0000 UTC is the combination of 11 members from the 0000 UTC cycle and lagged 11 members from the 1200 UTC cycle. The new NEPS shows improvements in terms of forecast agreement among the members in comparison with the previously operational NEPS that was running at 33 km horizontal grid size with 44 perturbed members. The ratio between the root mean square error of the ensemble mean and ensemble spread as a function of lead time has improved in both the Northern and Southern Hemispheres in the new NEPS.



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NCMRWF Global Ensemble Prediction System (NEPS-G) 33km vs 12km

**Both NEPSs, n1024 (12km) and n400 (33km) were operational during the
period**

1st June 2018 – 16th July 2018



Key distinction among 33km NEPS and 12km NEPS



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	33km NEPS (N400)	12km NEPS (N1024)
Grid Points	800 x 600	2048 x1536
Members	44 perturbed + 1 cntl	22 perturbed +1 cntl
Initial condition perturbations	Perturbations in θ , π , q , u , & v by ETKF method	Perturbations in θ , π , q , u , & v by ETKF method and perturbations in SST , SMC & Deep Soil Temp
Model Physics Perturbations	Stochastic Kinetic Energy Backscattering and Random Parameter Schemes	Stochastic Kinetic Energy Backscattering and Random Parameter Schemes
Observations Assimilated in NEPS	AIRS, ATOVS, Aircraft, GOESClear, GPSRO, IASI, Satwind, Scatwind Sonde, Surface	AIRS, ATOVS, Aircraft, GOESClear, GPSRO, IASI, Satwind, Scatwind Sonde, Surface, SEVIRIClear, SSMIS
Long Forecast Start time	44 members at 00 UTC	11 members and Cntl at 00 UTC and 11 members at 12UTC of previous day

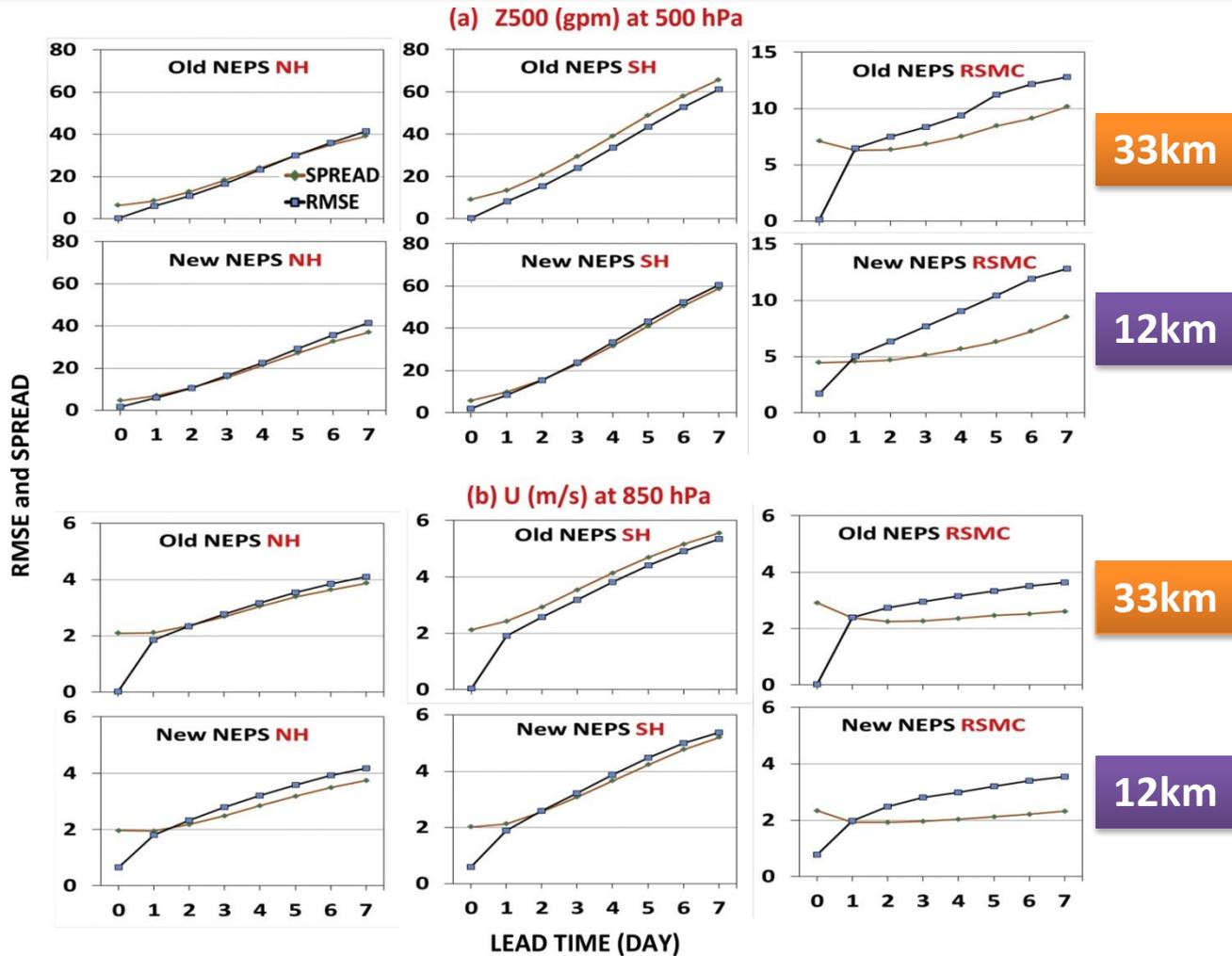
This table is based on 2018 configurations of the NEPSs



RMSE-SPREAD Relationship



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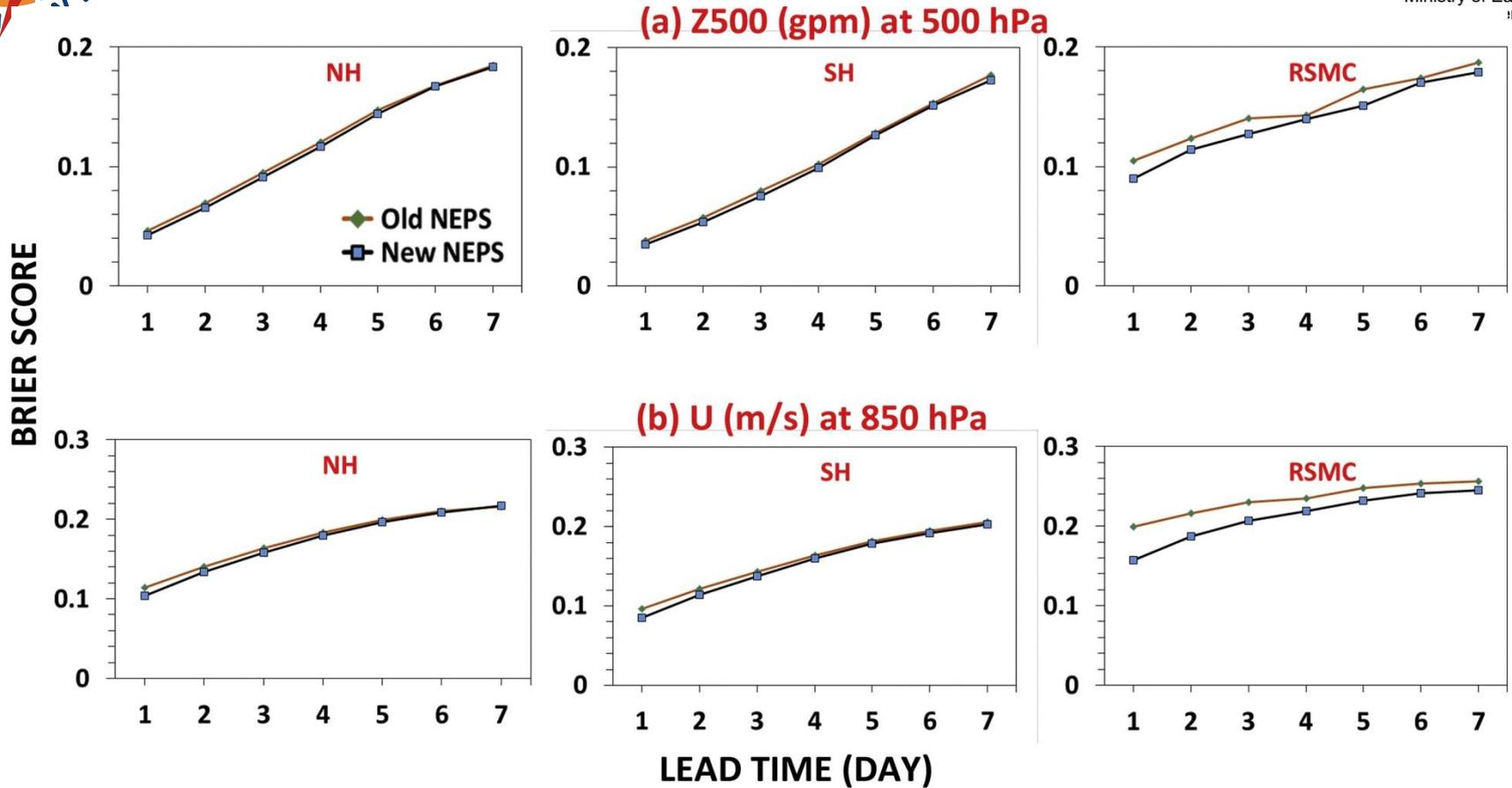
RMSE and ensemble spread of the old and new NEPSs as a function of forecast lead time over NH, SH and RSMC regions for (a) geopotential height at 500 hPa and (b) zonal wind at 850 hPa. RSMC region (0 – 40 N & 50 - 100 E)



BRIER SCORE



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Brier Scores of old and new NEPSs as a function of forecast lead time over NH, SH and RSMC regions for (a) geopotential height at 500 hPa and (b) zonal wind at 850 hPa. One standard deviation greater than the sample data climatology has been used as threshold.



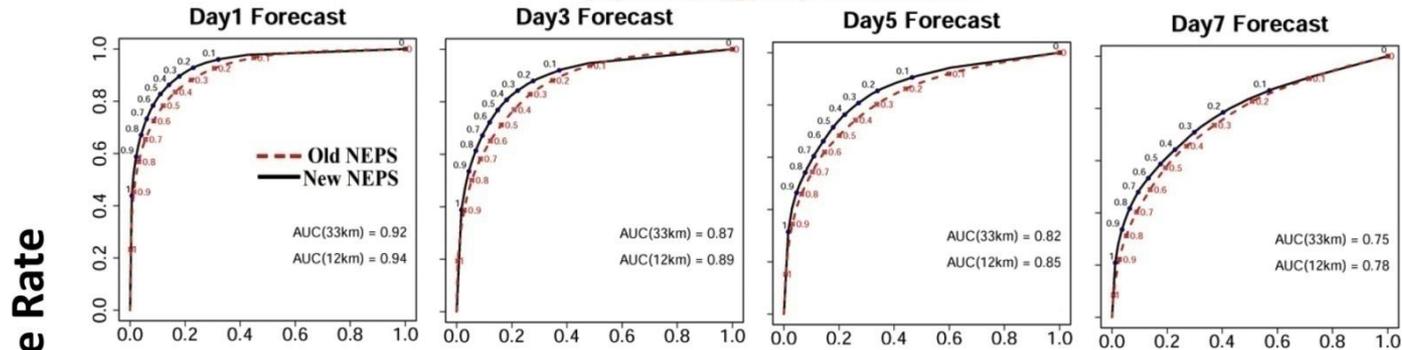
Relative Operating Characteristic (ROC)



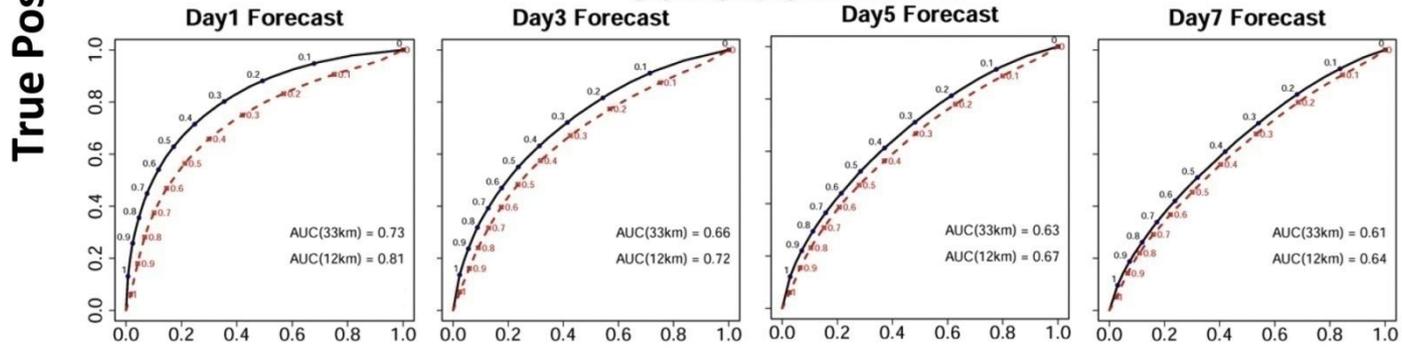
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ROC RSMC

(a) Z500 (gpm) at 500 hPa



(b) U (m/s) at 850 hPa



False Positive Rate

True Positive Rate

ROC curves of old and new NEPSs over RSMC region for Day 1, 3, 5 & 7 forecasts for (a) geopotential height at 500 hPa and (b) zonal wind at 850 hPa forecasts. One standard deviation greater than the sample data climatology has been used as threshold.



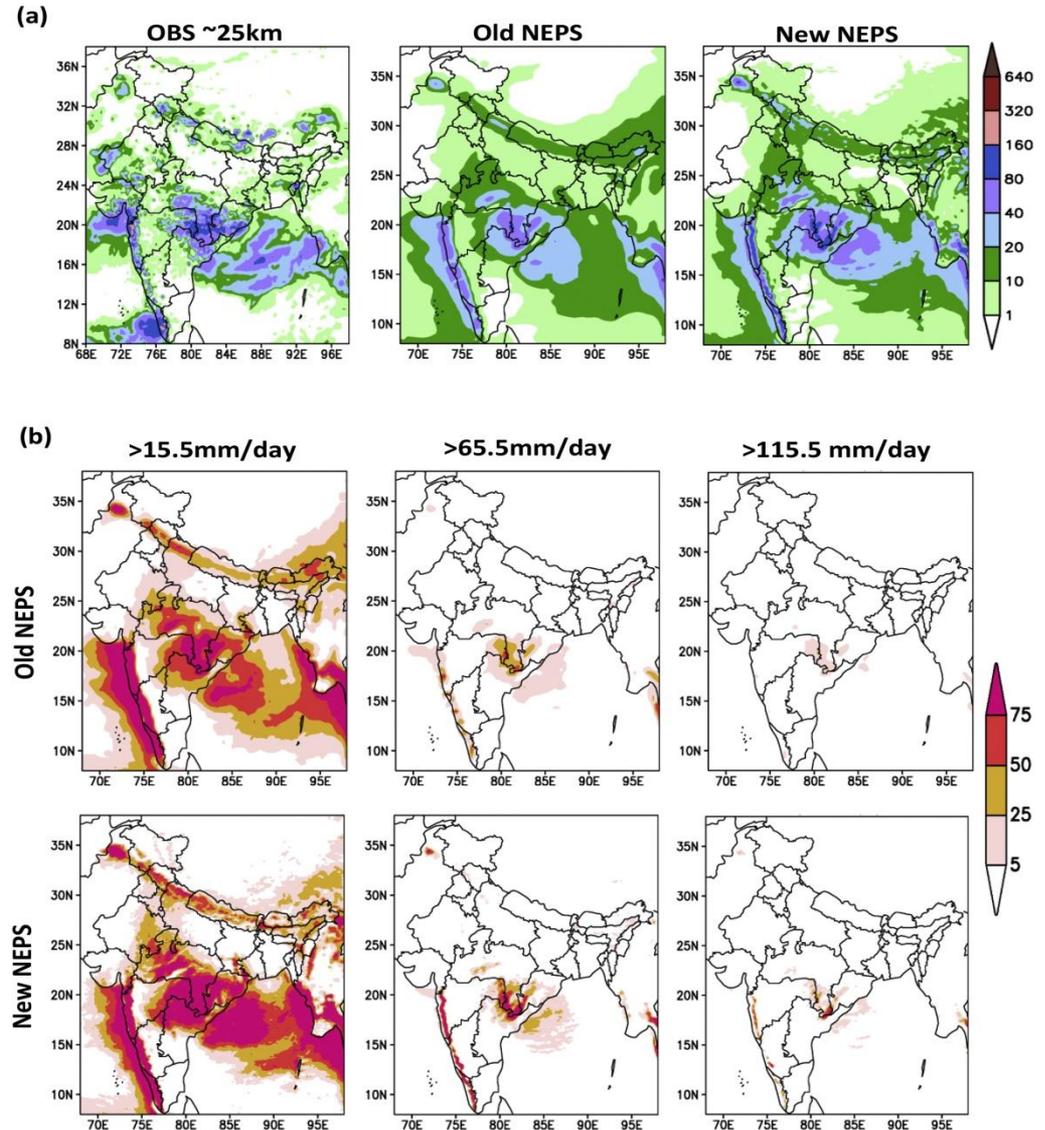
Probability of rainfall exceedance



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a) Day 7 Forecast of old and new NEPS ensemble mean rainfall (mm/day) valid on 16th July 2018 along with observed rainfall

b) Probability of precipitation forecast of old (33km) and new (12km) NEPSs exceeding the threshold values of 15.5, 65.5 and 115.5 mm/day.





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Improvements in tropical cyclone forecasting through ensemble prediction system at NCMRWF in India

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Available online 8 May 2020

Abstract

This paper deals with the comparison of cyclone forecasts from the two versions of the operational global ensemble prediction system (EPS) at the National Centre for Medium Range Weather Forecasting (NEPS). The previous version had a horizontal resolution of 33 km with 44 ensemble members (NEPS) whereas the updated version of this EPS has a resolution of 12 km with 11 members (NEPS-UP). The ensemble mean forecasts from both the models are compared using the direct position (DPE), along (ATE) and cross track (CTE) errors. For the verification of strike probability, Brier Score (BS), Brier Skill Score (BSS), Reliability Diagram, Relative Operating Characteristic (ROC) Curve and Root Mean Square Error (RMSE) in mean Vs Spread in members are used. For verification of intensity, RMSE in maximum wind speed from the ensemble mean forecasts are compared.

Comparison of ensemble mean tracks from both models showed lower errors in NEPS-UP for all forecast lead times. The decrease in the DPE, ATE and CTE in NEPS-UP was around 38%, 48% and 15% respectively. NEPS-UP showed lower BS and higher BSS values indicating a better match between observed frequencies and forecast probabilities as well as higher prediction skills. The reliability diagram showed higher accuracy for NEPS-UP as compared to NEPS. The ROC curves showed that for forecasts with higher probabilities the hit rate was high in NEPS-UP. There was a greater consensus between the RMSE and Spread for NEPS-UP at all lead times. It was also seen that the RMSE in mean showed a 41% decrease from NEPS to NEPS-UP. On comparing maximum wind, it was found that for all lead times the RMSE in maximum wind speed for NEPS-UP was lower than NEPS.

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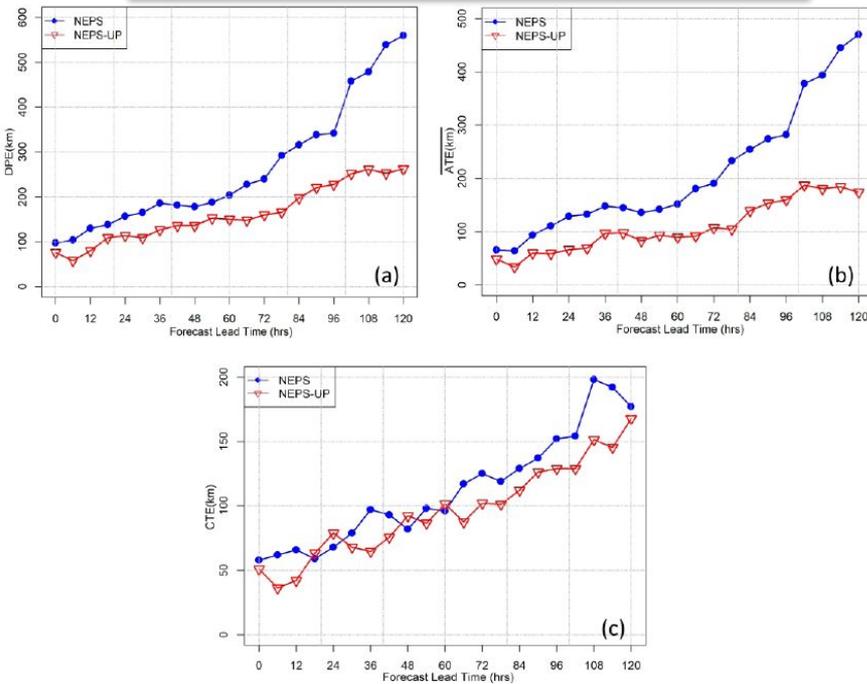


NEPS: 33km 44 mem Vs NEPS-UP: 12km 22 mem Tropical Cyclone



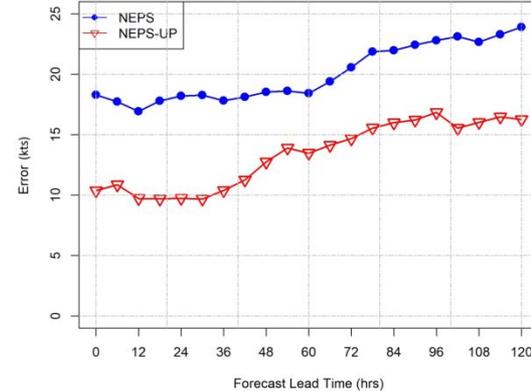
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Track Errors



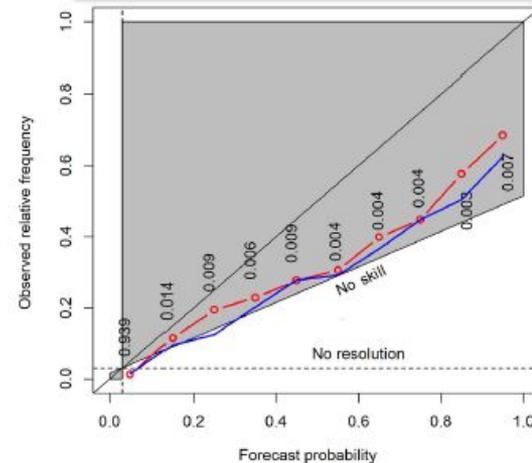
Comparison of (a) DPE, (b) ATE and (c) CTE for tropical cyclone forecasts obtained from NEPS-33km and NEPS-12km with respect to forecast lead time.

RMSE of 10m Max Wind Speed



Comparison of the RMSE in the maximum wind speed forecasts for a tropical cyclone obtained from NEPS-33km and NEPS-12km with respect to forecast lead time

Reliability diagram Strike probability



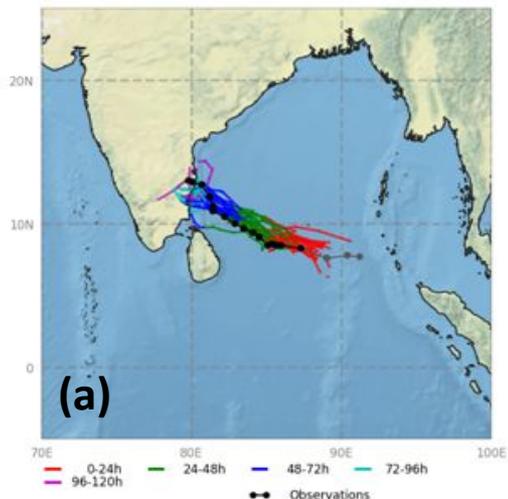
Comparison of the Reliability diagram for the strike probability forecasts from NEPS-33km and NEPS-12km



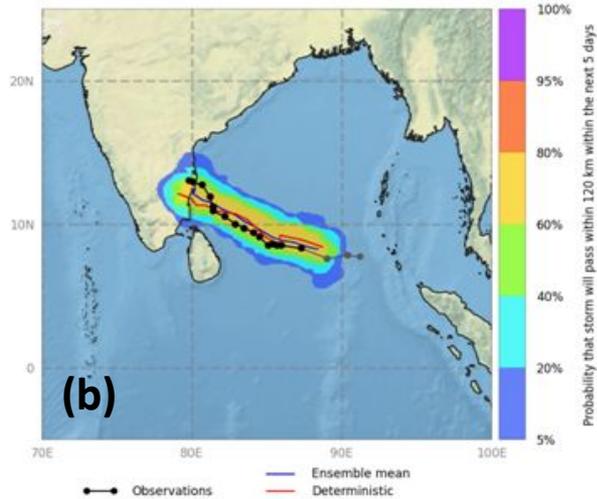
Some of the NEPS-G products based on a cyclone case MANDOUS

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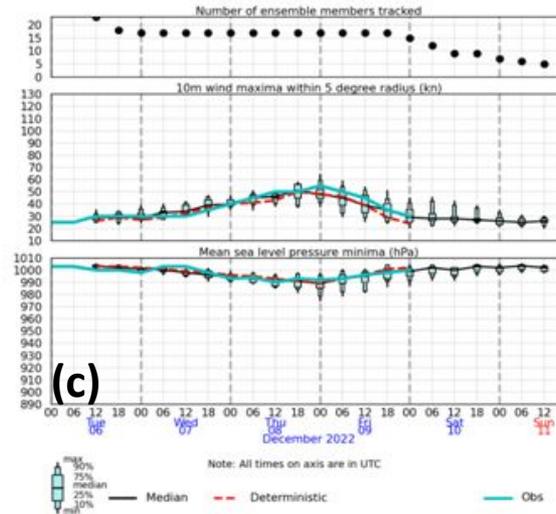
NEPS-G 12km_22mem: Forecast TC tracks for 96B from 12 UTC Tue 06 Dec 2022



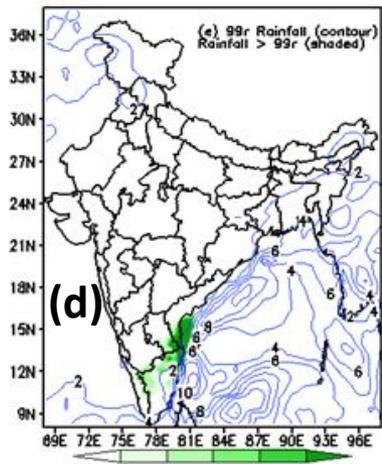
NEPS-G 12km_22mem: Forecast TC track probability for 96B from 12 UTC Tue 06 Dec 2022



NEPS-G 12km_22mem ensemble: TC-following meteorogram 96B (8.3N 87.3E) from 12 UTC Tue 06 December 2022

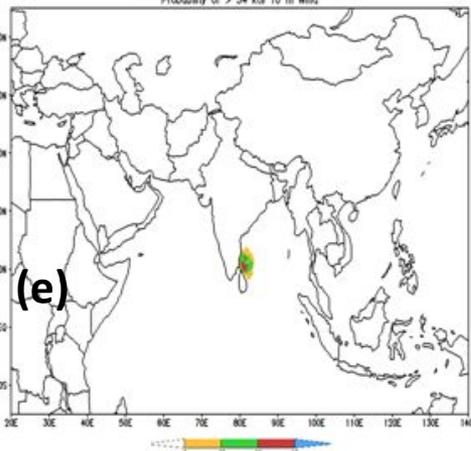


NEPS Day-3 FCST Valid for 10Dec2022: Rainfall (cm/day)



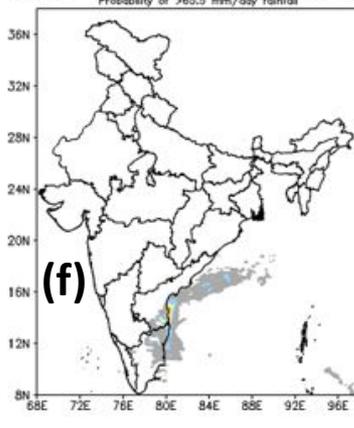
Rainfall > 99 percentile

NEPS Based Probabilistic 10 m Wind Forecast
IC:20221207 48-hr Forecast
Probability of > 34 kts 10 m Wind

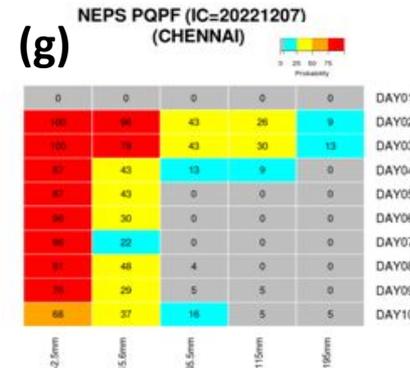


Probability > 34 knots 10m wind

NEPS Based Probabilistic Quantitative Precipitation
IC:20221207 Day-3 Forecast Valid for 10Dec2022
Probability of >65.5 mm/day rainfall



Probability > 65.5 mm/day rainfall



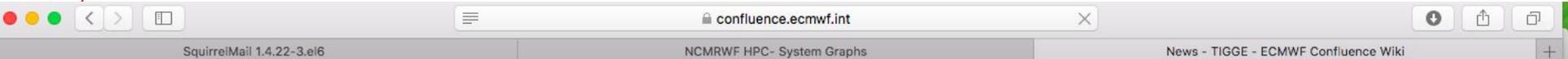
Probabilistic quantitative precipitation forecasts (PQPFs)



12-km NCMRWF-EPS in TIGGE Portal



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TIGGE TIGGE

SPACE SHORTCUTS

- S2S
- TIGGE
- TIGGE-LAM
- UERRA
- YOPP

PAGE TREE

- News
- Description
- Support
- Resources
- Site map

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News

Created by Richard Mladek, last modified about an hour ago

[2018] [2017] [2016] [2015] [2014] [2012] [2011] [2010] [2008] [2007] [2006]

2018

24-07-2018 NCMRWF forecast system change
Update of NCMRWF forecast system. A new version of NCMRWF model was introduced. The first archived updated model runs are from the 1st of July. The main changes are:

- reduced number of the ensemble size from 45 to 12
- two model runs 00 and 12 UTC at very high resolution (0.12x0.18 degree)

Click [here](#) for more details.

18-06-2018 Usage statistics
A new page with [TIGGE data usage statistics](#) was added.

2017

20-12-2017 New model (NCMRWF, India) added to TIGGE archive
New model outputs (NCMRWF, India) were added to TIGGE archive. The first starting date available thanks to the back-archiving is the 1st of August 2017. Click [here](#) for more details.

11-07-2017 ECMWF forecast system change
Update of ECMWF forecast system. A new version of ECMWF model (IFS cycle 43r3) was introduced. Click [here](#) for more details.



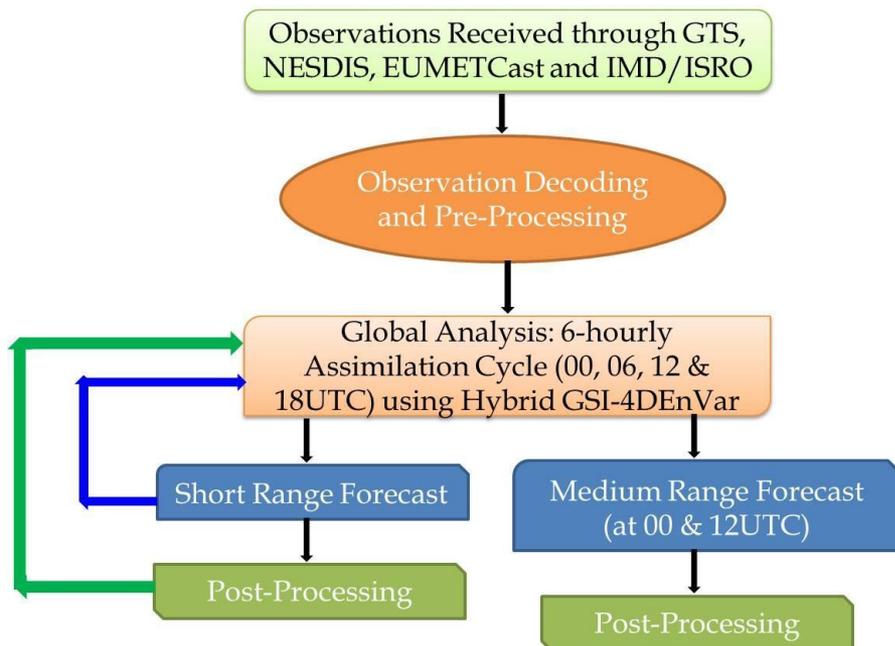
GSI-GFS Data Assimilation System in NCMRWF



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Another global DA systems operational at NCMRWF is the GFS (Global Forecast System) based GSI-4D_{En}Var (Global Statistical Interpolation – 4 Dimensional Ensemble Variational) system which provides initial conditions for the IMD GFS NWP system.

The NCEP (National Centre for Environmental Prediction) based DA system implemented at NCMRWF has been upgraded periodically and improved with in-house R&D efforts.



The GSI-4D_{En}Var at NCMRWF uses 80 member ensembles for updating the error covariances.



MoES Global Grand Ensemble (NEPS-G) + (GEFS)

Operationally, two high resolution (~12 km horizontal resolution) Global Ensemble Prediction Systems (EPS), viz, NEPS & GEFS are running in Mihir HPC in the NCMRWF

To determine any added benefit that can be obtained from a super-ensemble consisting of the union of the members from:

1. NCMRWF global EPS named as **NEPS**, is based on UK Met Office MOGREPS system
2. IMD **GEFS** based on National Centers for Environmental Prediction (NCEP) system



Configurations of the Global EPSs used in this study



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	NEPS (NCMRWF)	GEFS (IMD)
Members	22 (00UTC+12UTC)	20 (00UTC)
Horizontal grid resolution	~ 12km (N1024)	~ 12km (T1534)
Vertical levels	70 (~80 km)	64 (~2.73hPa)
Initial perturbation strategy	Ensemble Transform Kalman Filter (ETKF)	Analysis perturbation from ETR (Ensemble Transform with Rescaling) and forecast perturbation comes from EnKF ensemble
Surface Perturbations	SST, Deep soil temperature and Soil Moisture Perturbations	NSST
Physics Perturbation method	Stochastic Kinetic Energy Backscattering (SKEB) and Random Parameter (RP) schemes	Stochastic total tendency perturbation (STTP). Stochastic perturbation to account for random model errors.
Data assimilation method for control analysis	Hybrid 4D-Var	Hybrid 4D-Ens-Var(GSI)



Reliability Diagram



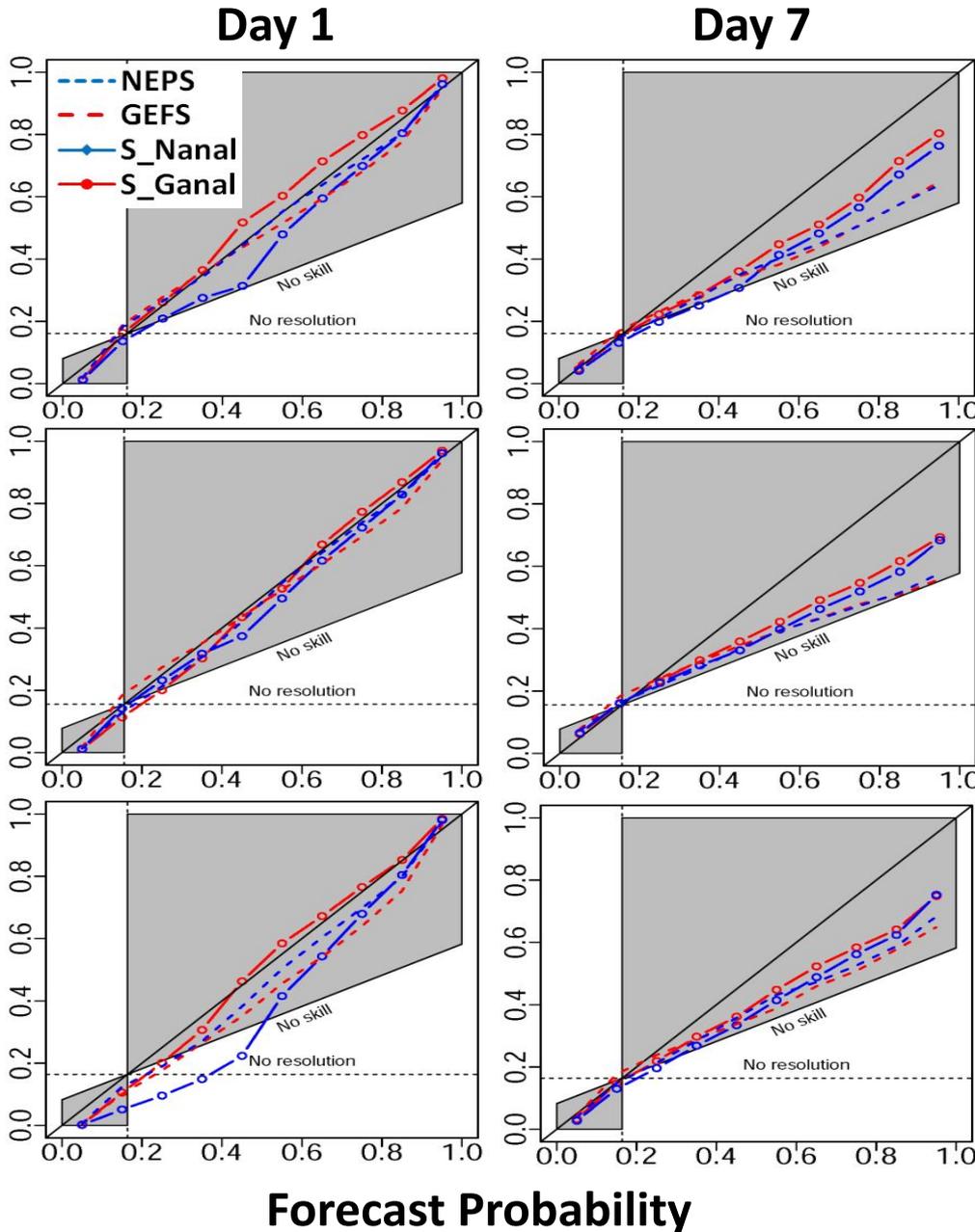
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T850

U850

Z500

Observed Relative Frequency



A measure of agreement between the probabilistic forecasts and the observations

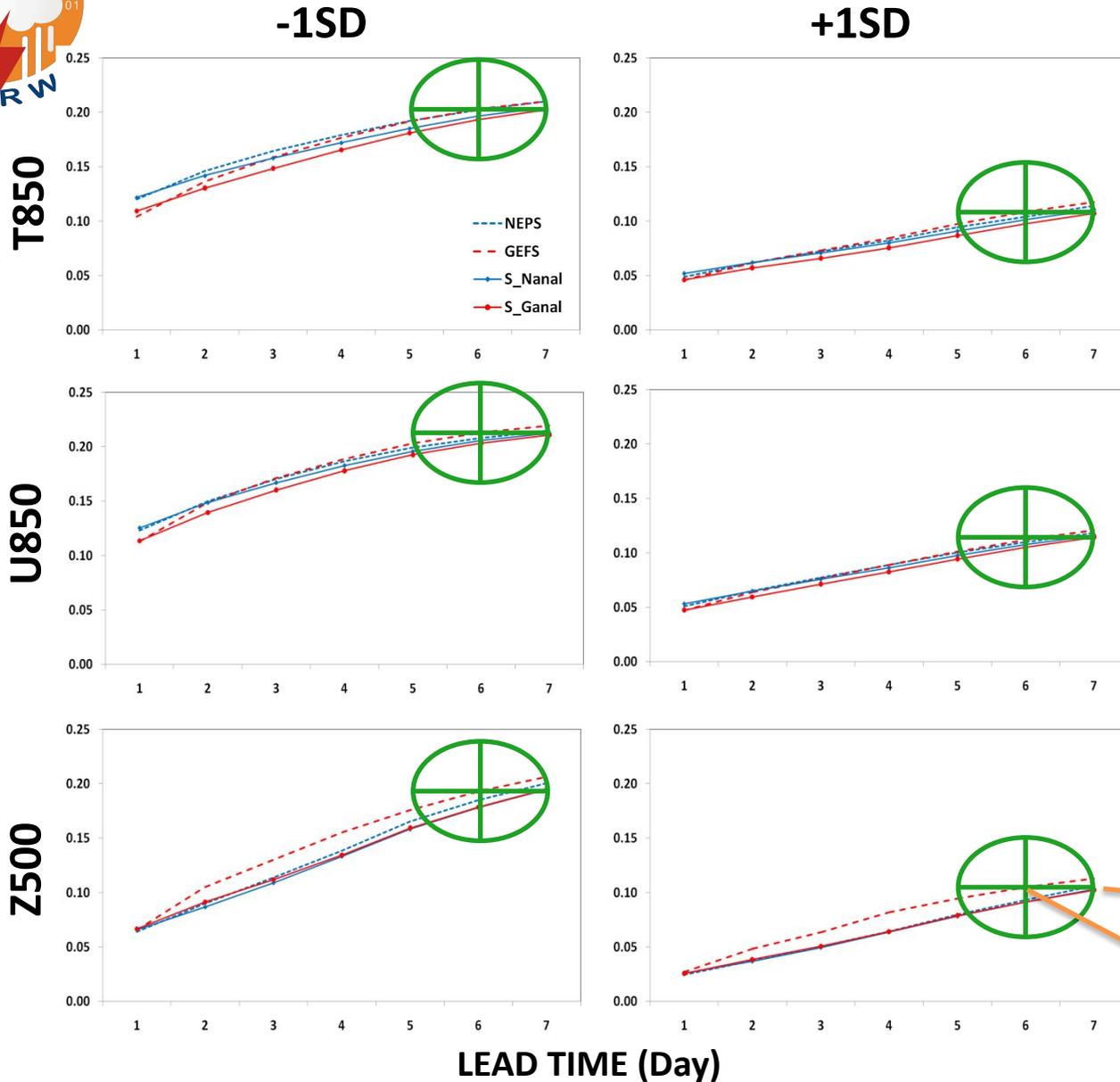
- greater than 1 standard deviation from the sample climatology is considered as event.
- With an increase in the forecast probability of the occurrence of events, the verified chance of observing the event is also increasing.
- Reliability curve is mostly indicating over forecasting
- Super ensemble shows better reliability for Day 7 forecast for probability greater than 40%



Brier score



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- The Brier Score is a measure of probability forecast accuracy for dichotomous events
- The best possible value of the Brier Score for total accuracy is 0 and the worst value is 1
- Nearly one day improvement in predictability has been noticed with increase in the ensemble size

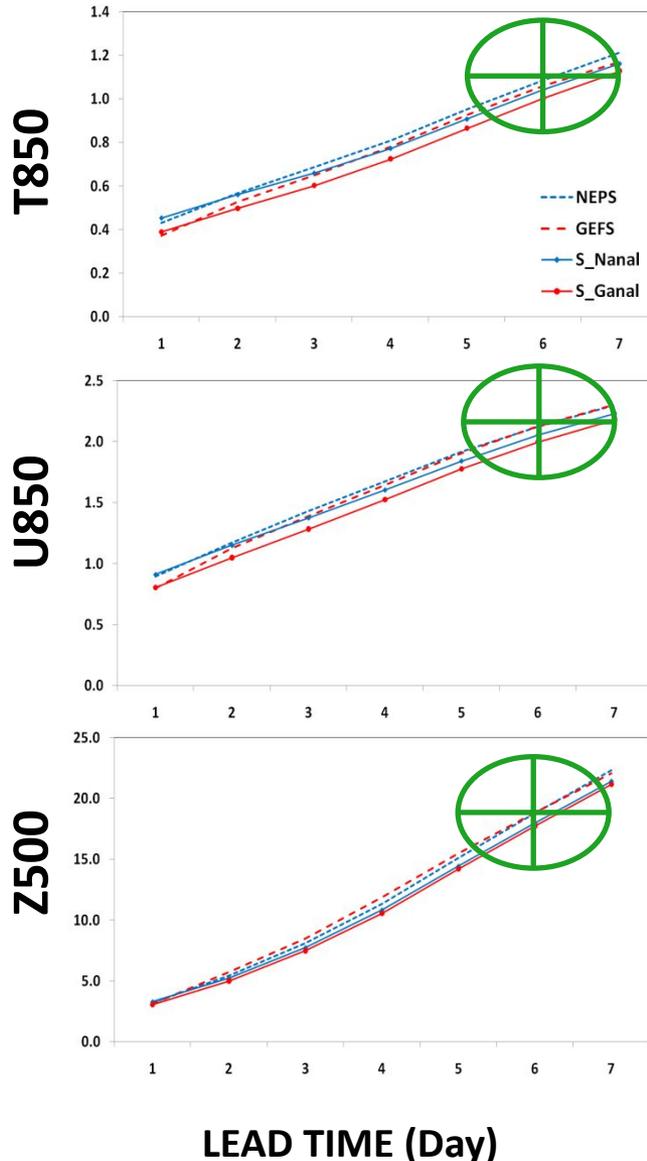
Day 7 BS of Super Ensemble
are comparable to
Day 6 BS of single EPS



Continuous Ranked Probability Score



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- CRPS is analogous to Brier Score with an infinite number of continuous classes
- It is an integral of the Brier score over a continuum set of all possible thresholds of the selected variables
- For a perfect case it reaches a minimum value of zero.
- Results indicate Improved CRPS for super ensemble as compared to the individual models



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NCMRWF Regional Ensemble Prediction System (NEPS-R)



NEPS-R Running operational since July 2019



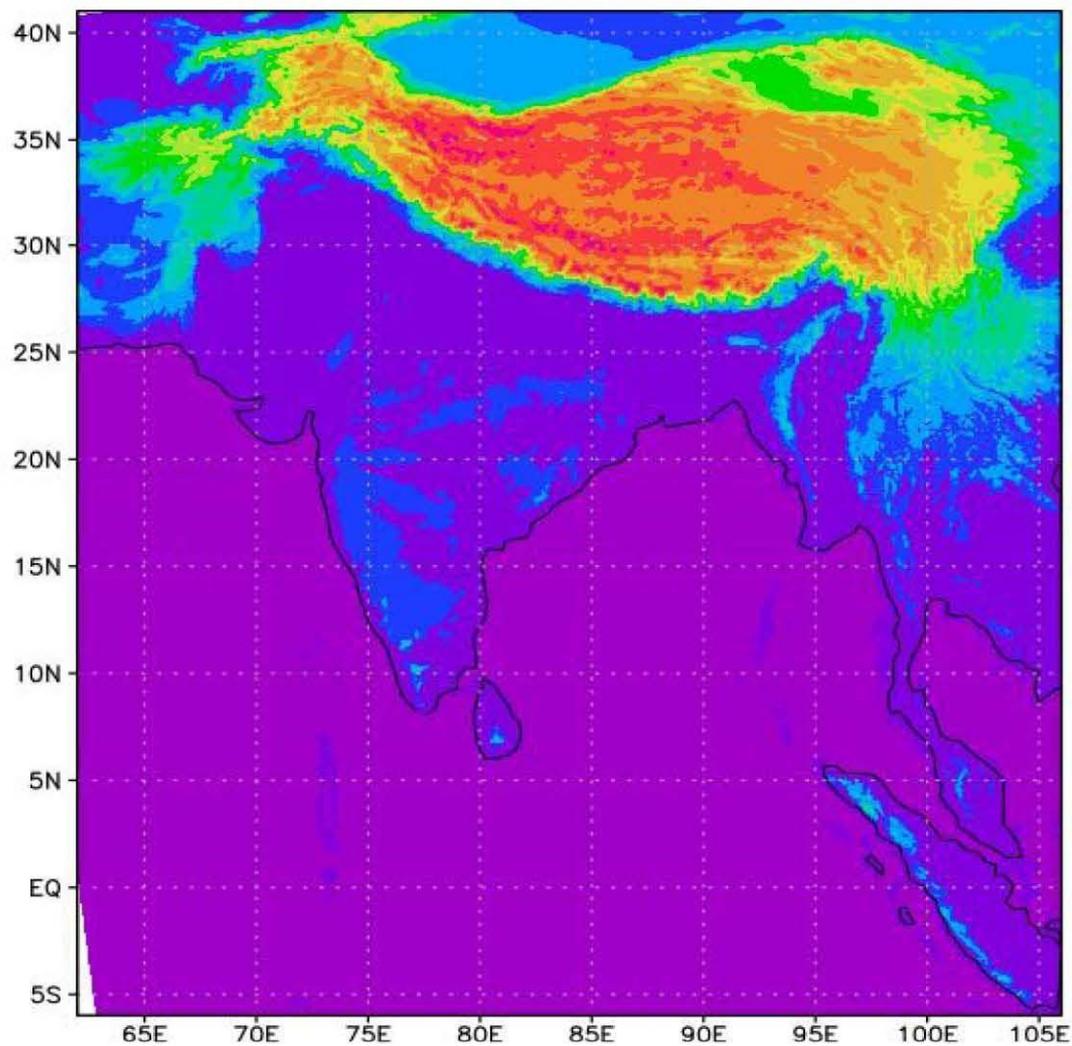
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Current UM version	: 11.1
Science Configuration	: Pre-chill RA2T (conserve)
Horizontal resolution	: ~4 km
Vertical levels	: 80 levels up to 38.5 km
Model Domain	: 62⁰ E -106⁰ E and 6⁰ S - 41⁰ N
No. Of grid points	: 1200 x 1200
Model time step	: 60 seconds
Ensemble size	: 12 (1 control + 11 perturbed)
Initial Conditions (IC)	: Downscaled from NEPS-G (12 km resolution)
Convection	: Explicit
Physics Perturbation	:Random Parameter scheme
LBC frequency	: 3 hourly
Forecast length	: 75 hrs (once per day at 00 UTC)
Resources (Cray XC-40)	: 30 nodes /member completes 75hrs forecast in 3 hrs



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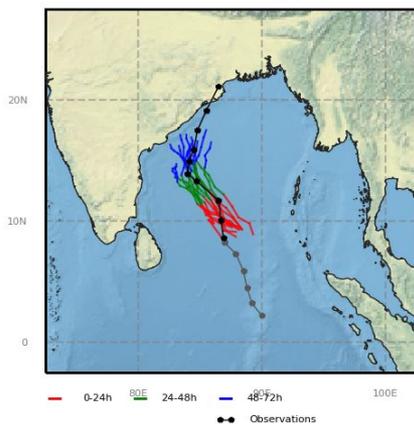
NEPS-R Operational Domain



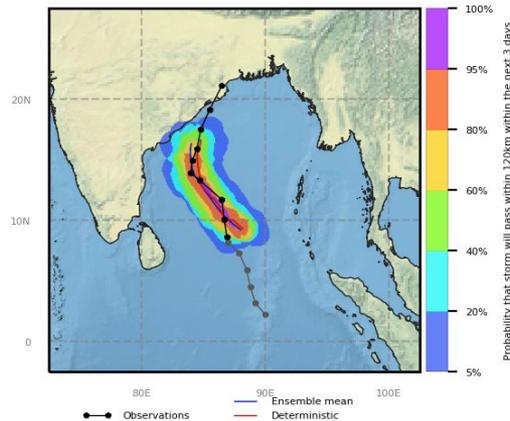


(a) NEPS-R (4km Regional EPS)

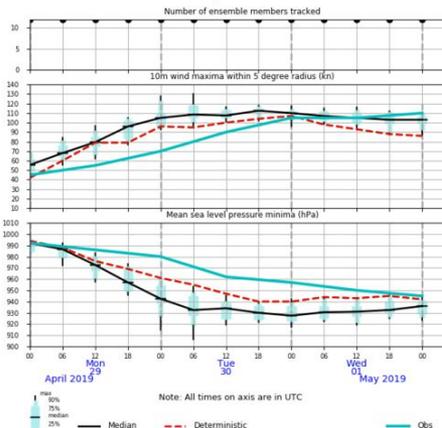
NEPS-R_4km_FANI: Forecast tropical storm tracks for FANI from 00UTC 29/04/2019



NEPS-R_4km_FANI: Forecast tropical storm strike probability for FANI from 00UTC 29/04/2019

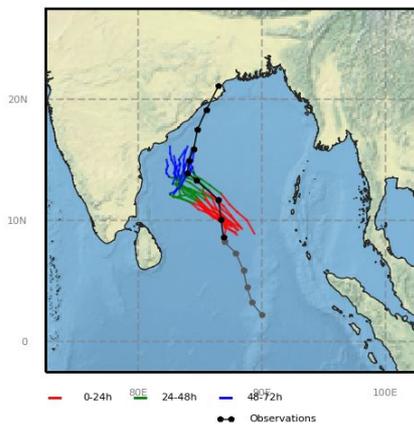


NEPS-R_4km_FANI ensemble: Tropical Cyclone storm-following meteogram FANI (8.3N 87.4E) from 00UTC 29 April 2019

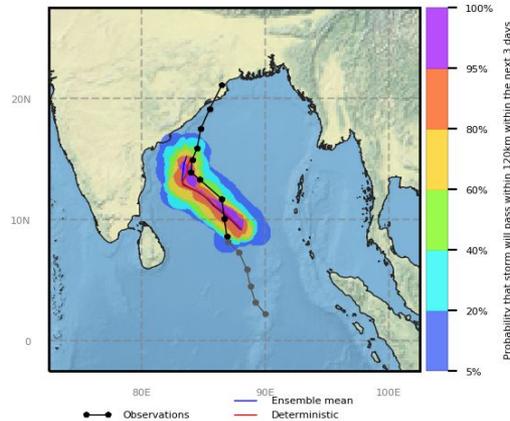


(b) NEPS-G (12km Global EPS)

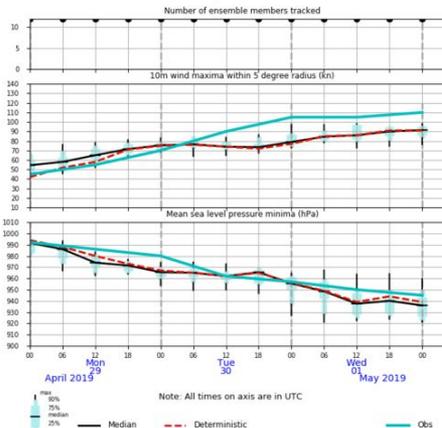
NEPS-G_12km_FANI4reg: Forecast tropical storm tracks for FANI from 00UTC 29/04/2019



NEPS-G_12km_FANI4reg: Forecast tropical storm strike probability for FANI from 00UTC 29/04/2019



NEPS-G_12km_FANI4reg ensemble: Tropical Cyclone storm-following meteogram FANI (8.3N 87.4E) from 00UTC 29 April 2019



Tropical cyclone FANI, intensified into an extremely severe cyclonic storm and reached its peak intensity on 2nd May 2019. The rapid intensification in wind speed has been nicely captured by NEPS-R as compared to NEPS-G as shown in storm following meteograms. However, NEPS-G performs better in initial stage of cyclone development



RMSE and ensemble spread



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Zonal wind 850 (m/s) or U850

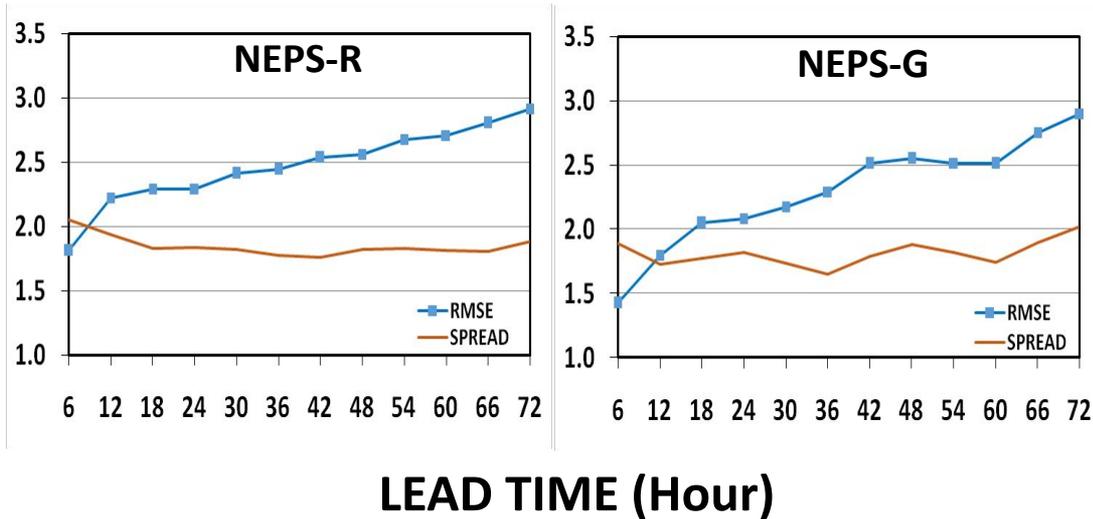


Fig.1 NEPS-R spread in U850 is slightly higher than that in NEPS-G during starting hours only and after that it is nearly constant. U850 ensemble spread of NEPS-G is varying between 1.6 and 2 (m/s) and not increasing with forecast lead time.

Precipitation (mm/day)

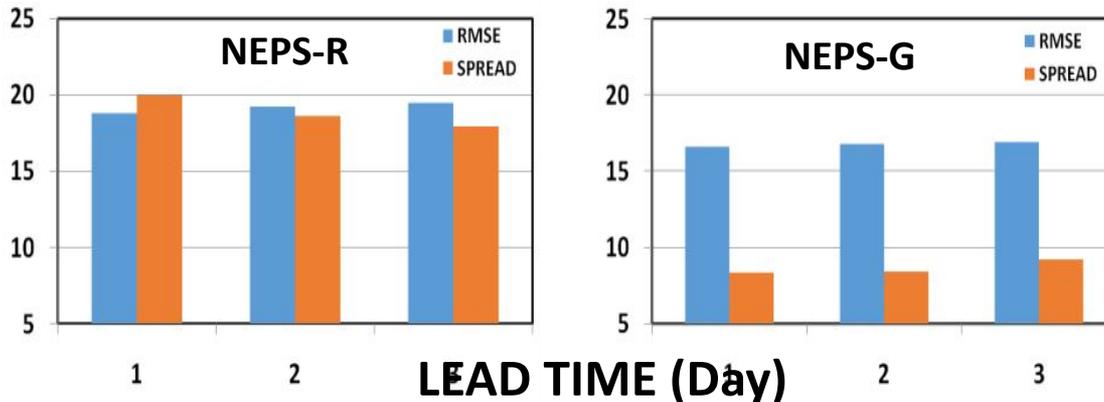


Fig.2 RMSE and spread in precipitation are much closer to each other in NEPS-R as compared to NEPS-G. RMSE is slightly better in case of NEPS-G. A larger spread is noticed in NEPS-R. Whereas in NEPS-G, precipitation values are more under-dispersed.



Probabilistic Quantitative Precipitation

Day-3 valid for 03Z09AUG2018



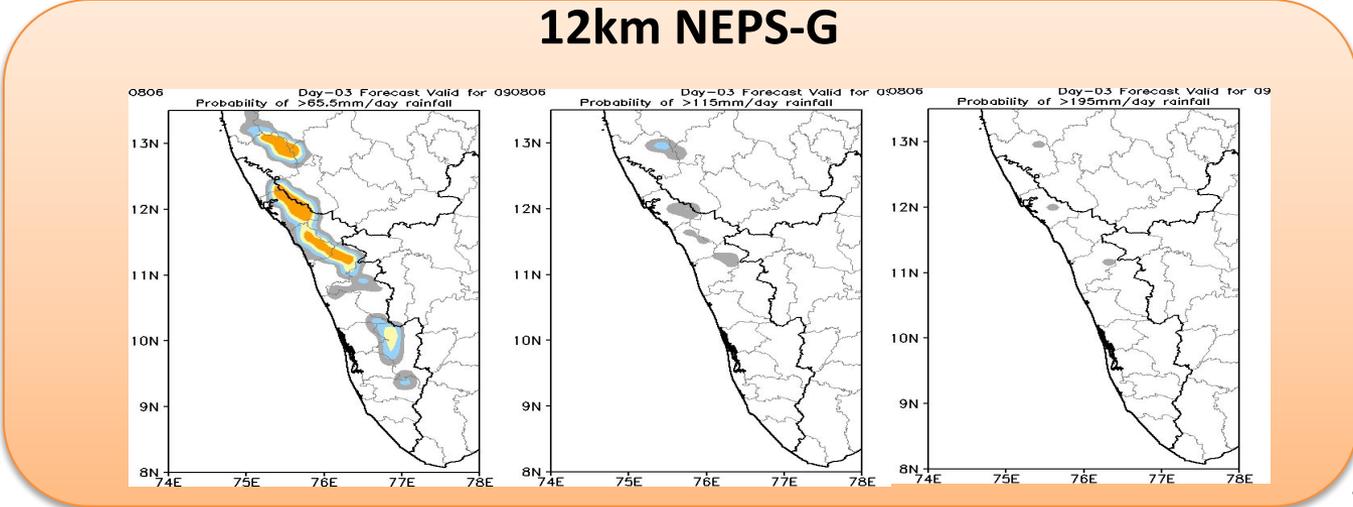
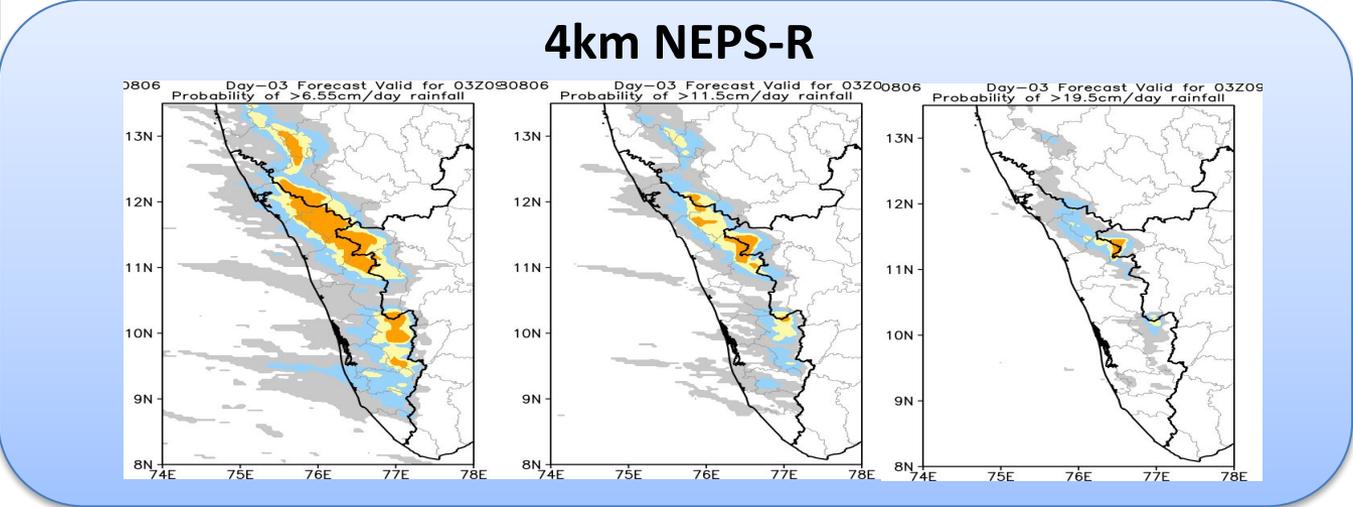
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IC:20180806-00UTC

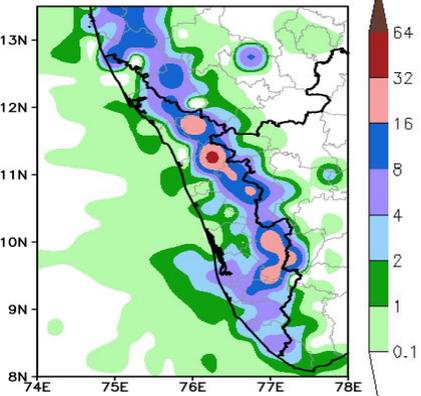
>65.5mm/day

>115mm/day

>195mm/day



Observation



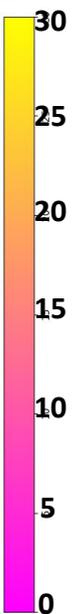
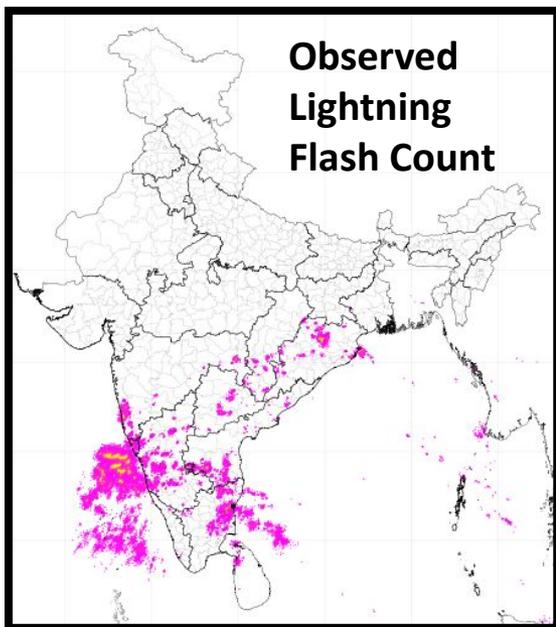


Probabilistic lightning forecast of NEPS-R

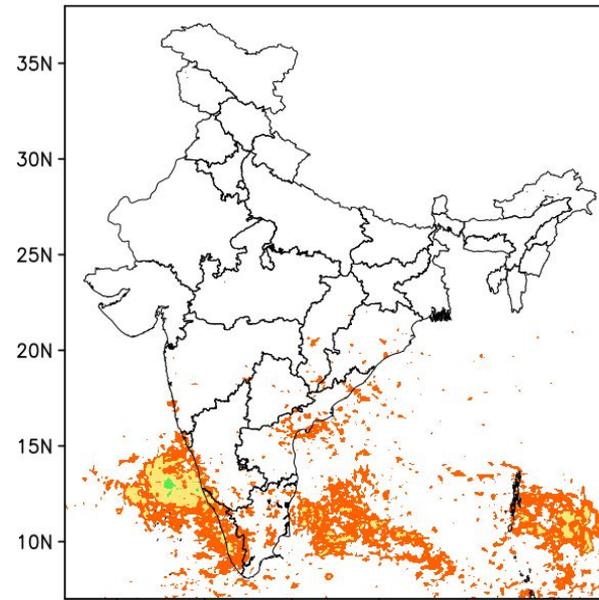


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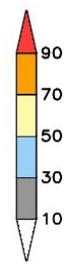
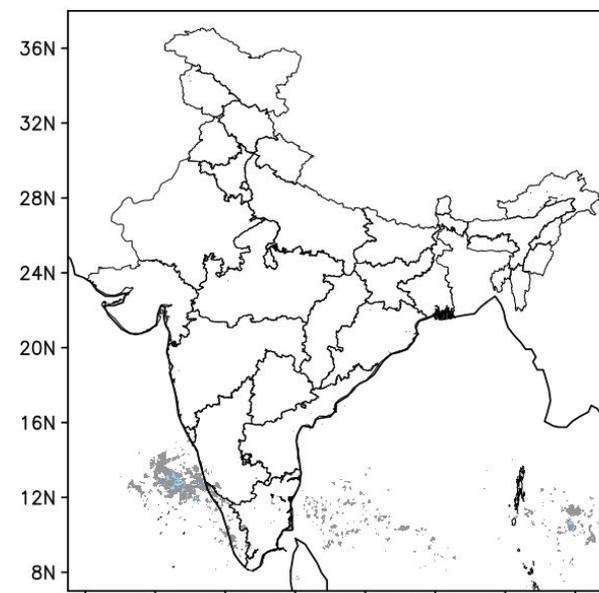
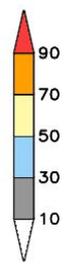
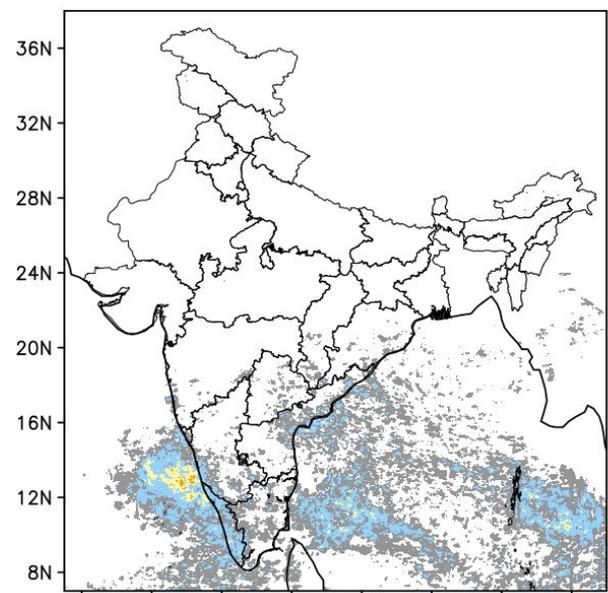
Ensemble Mean lightning flashes(f/day)
IC:20211112 Day-3 FCST Valid for for 03Z15NOV2021



Day-3



Probability of >10 lightning flashes





Future Objectives:

- Currently, NCMRWF, MoES is in the process of acquiring a 9 PFLOPS machine for the centre, which will help to improve the weather forecasting in India of different temporal scales.
- En-4DEnVar that is an ensemble of initial conditions which are generated through their own data assimilation cycles and provides a more sophisticated and stable method of producing probabilistic forecasts than the present ETKF scheme.
- “additive inflation” scheme to controls the growth of ensemble spread during the forecast. The scheme also includes a bias-correction term in the ensemble forecasts which is a new and effective way to reduce systematic forecast errors and thus improve forecast verification scores.
- Increase in the Ensemble size for both global and regional EPS



National Centre for Medium Range Weather Forecasting

