Verification of Pre-Monsoon Temperature Forecasts over India during 2016 with focus on Heatwave Prediction

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Abstract. The operational medium-range weather forecasting based on Numerical Weather Prediction (NWP) models are complemented by the forecast products based on Ensemble Prediction Systems (EPS). This change has been recognized as an essentially useful tool for the medium range forecasting and is now finding its place in forecasting the extreme events. Here we investigate extreme events (Heatwaves) using a high-resolution numerical weather prediction and its ensemble

10 forecast in union with the classical statistical scores to serve the verification purposes.

1) ith the advent of climate change related studies in the recent past, the rising extreme events and their plausible socioeconomic effects have encouraged the need for forecasting and verification of extremes. Applying the traditional verification scores and the associated methods on both, deterministic and the ensemble forecast, we attempted to examine the performance of the ensemble based approach as compared to the traditional deterministic method. The results indicate

15 towards an appreciable competence of the ensemble forecasting detecting extreme events as compared to deterministic forecast. Locations of the events are also better captured by the ensemble forecast. Further, it is found that the EPS smoothes down the unexpectedly soaring signals, which thereby reduce the false alarms and thus prove to be more reliable than the deterministic forecast.

1. Introduction

- 20 Reliable weather forecasting plays a pivotal role in our everyday activities. Over the years NWP systems have been employed to serve the purpose. While the NWP models have demonstrated an improved forecasting capability in general, they still have a challenge in the accurate prediction of severe weather/extreme events. Severe weather events (thunderstorms, cloudburst, heatwaves and coldwaves2etc) usually involve strong non-linear interactions ,often between small scale features in the atmosphere (Legg and Mylne, 2004). For example, development of deep convection and
- 25 thunderstorms in the tropics. These small-scale interactions are difficult to predict accurately (Meehl et al., 2001) and a small deviation in these could lead to completely different results, as a result of the forecast evolution process (Lorenz, 1969). The inherent uncertainty in the weather and climate forecasts can be well handled by employing ensemble based forecasting (Buizza et al., 2005). The EPS (Interact et al., 1993, Toth and Kalnay, 1997, Molteni et al., 1996) were first introduced in the 1990s in an effort to quantify the uncertainty caused by the synoptic scale baroclinic instabilities in the
- 30 medium range weather forecasting (Legg and Mylne,2004). Ensemble forecasting has emerged as the practical way of estimating the forecast uncertainty and making probabilistic forecasts. It is based on multiple perturbed initial conditions, ensemble approach samples the errors in the initial conditions to estimate the forecast uncertainty (spread in member



Summary of Comments on Microsoft Word -Temp_verification-Revised-05Apr2017

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forecasts). The skill of the ensemble forecast shows marked improvement over the deterministic forecast when comparing the ensemble mean to deterministic forecast after a short lead time

The new EPS at the NCMRWF is now running for operational purposes. This global medium-range weather forecasting system has been adopted from the UK Met Office (Sarkar et al., 2016). Generally, the model and the ensemble forecast

- 5 applications in addition to their verifications are used for prevalent events with a limited focus on the rare extreme weather events. It would be for the first time that the EPS technique has been employed from this model output for the extreme events over India to study the heatwave events. The heatwave is considered if maximum temperature of a station reaches at least 40°C or more for Plains and at least 30°C or more for Hilly regions. Based on departure from normal, a station is declared to have heatwave conditions if departure from normal is 4.5°C to 6.4°C and severe heatwave if the departure from
- 10 normal is >6.4°C. In terms of the actual maximum temperature, a station is under heatwave when actual maximum temperature ≥ 45°C and severe heatwave when the maximum temperature is >47°C. There has been increasing interest in predicting such extremes, the heatwave and cold wave events in India due to the associated loss of life. An increasing number of extreme temperature events over India were documented by a few recent studies (Qin et al., 2013). 1 study conducted over the Indian sub-continent between 1969 and 1999 indicated more frequent cold and heatwave events over the
- 15 Indo-Gangetic plains of India. 2-6 heatwave events and 2-3 cold wave events are reported to occur every year in the Northern parts of the country. The global temperatures have exhibited a warming trend of about 0.85°C due to anthropogenic activities between 1880 and 2012. Similar trends were also observed in India with the annual air surface temperature rise during 20th century. This is evident from the detailed study presented in Kothawale et al (2010) based on the data from 1901-2007.
- 20 3 he Indian mean maximum and minimum annual temperatures have significantly increased by 0.51, 0.71 and 0.27°C per 100 years respectively, during 1901-2007. However, an accelerated warming was observed during 1971-2007, mainly due to the last decade 1998-2007. The study highlights that the mean temperature during the pre-monsoon season (March-May) shows an increasing trend of 0.42°C per 100 years. On the other hand, a recently reiterated IPCC report (2013) notified an "unequivocal" proof of the increasing warming trend, globally which could be associated with the variations in the climate
- 25 system. This indicates a need to comprehend the heatwave events on weather and climatic scales. This there is an extensive literature discussing the heatwave events and their trends on the climatic scales, however, the literature is rather limited (especially over India) focusing such events on monthly scales. This paper thus tries to fill in the gap and attempt to demonstrate the capability and strength of predicting such events using both ensemble and deterministic forecast. This research investigates the most recent heatwave events during the summer months March, April & May (MAM) 2016 in
- 30 India. This investigation considers two case studies to demonstrate the strength and weaknesses of the EPS approach in predicting such extreme events.

With these factors in mind, we can say that temperature (Minimum and Maximum both), forms a vital component of weather and climatic studies which are becoming increasingly important and challenging. Reliable projections of such changes in

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Tennant, W.J., Shutts, G.J., Arribas, A. and Thompson, S. A.: Using a Stochastic Kinetic Energy Backscatter Scheme to Improve MOGREPS Ensemble forecast Skill. *Mon. Weather Rev.*, **139**, 1190-1206, 2010.

Toth, Z., and E. Kalnay: Ensemble forecasting at NCEP and the breeding method. Mon. Wea. Rev, **125**, 3297–3319, 1997.

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 Igure 1. Frequency distribution of observed, and forecast (NCUM and NEPS) (a) *Tmax* (°C) and (b) *Tmin* (2) over India

 10
 during March-May 2016.

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1igure 2. Spatial distribution of observed and **2**CUM forecasts number of days with $Tmax \ge 40^{\circ}$ C during the period of March to May 2016

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1 gure 4.Mean Sea Level Pressure (MSLP) shaded and winds at 700 hPa showing heat low (a) Analysis of 20160410 (b)Day 3 forecast valid for 20160410 (c) Analysis of 20160521 (d) Day 3 forecast valid for 20160521

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Figure 9. Box plots for HK scores for different temperature ranges (Tmax) NCUM and NEPS form March to May 2016



ETS Scores for $\rm T_{max}, Day-1$ through Day-9 forecast, at different temperature thresholds



Figure 10. 10x plots for Equitable Threat Score (ETS) for NCUM and NEPS 2rm March to May 2016

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Table 2. <mark>1 asualities reported during MAM-2016 due to prevailing heatwaves over India</mark>

Month	State/ Region	No. of loss of	Total	
		lives		
	Maharashtra	1		
March	Kerala	1	2	
	Odisha	88		
	Telangana	79		
	AP	40		
April	Maharashtra	9	220	
	Karnataka	1		
•	Tamil Nadu	1		
	Telangana	200		
May	Gujrat	39	273	
	Maharashtra	34		

Table 3. Monthly $Tmax > 40^{\circ}$ C scores for CUM and NEPS forecast with IMD observed temperature

		NCUM				NEPS					
Month	Score	Day 1	Day 3	Day 5	Day 7	Day 9	Day 1	Day 3	Day 5	Day 7	Day 9
	POD	0.25	0.23	0.27	0.30	0.28	0.23	0.20	0.22	0.24	0.22
	FAR	0.81	0.71	0.75	0.75	0.79	0.49	0.54	0.53	0.53	0.43
MAR	ETS	0.09	0.09	0.09	0.08	0.08	0.10	0.09	0.10	0.11	0.11
	HK	0.22	0.21	0.24	0.27	0.25	0.21	0.18	0.21	0.23	0.21
	SEDI	0.33	0.32	0.36	0.38	0.36	0.31	0.30	0.34	0.34	0.33
	POD	0.39	0.39	0.38	0.36	0.36	0.43	0.43	0.41	0.42	-
	FAR	0.66	0.65	0.66	0.66	0.66	0.62	0.61	0.62	0.61	0.62
APR	ETS	0.16	0.16	0.15	0.15	0.15	0.19	0.19	0.19	0.19	0.19
	НК	0.30	0.29	0.28	0.27	0.26	0.34	0.34	0.34	0.33	0.33
	SEDI	0.46	0.45	0.45	0.43	0.42	0.51	0.51	0.52	0.51	0.50
	POD	0.30	0.30	0.28	0.26	0.24	0.32	0.34	0.31	0.31	0.27
	FAR	0.70	0.71	0.72	0.74	0.75	0.67	0.69	0.70	0.71	0.75
MAY	ETS	0.12	0.11	0.11	0.10	0.09	0.14	0.14	0.13	0.12	0.10
	НК	0.22	0.22	0.21	0.19	0.17	0.25	0.26	0.24	0.23	0.19
	SEDI	0.39	0.38	0.36	0.33	0.30	0.43	0.43	0.40	0.39	0.33

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Number: 2 Author: Bruce Subject: Highlight Date: 06-Apr-17 09:42:37 In Table headers and figure captions, these should be self-standing. So reader should not have to go to the text to figure out what they mean. Give what the acronyms mean. Tell us where the data is from. Tell us the period of the data.