



EMMDA International Conference - 24-26 February 2020

## **LETKF-ROMS: An improved predictability system for the Indian Ocean.**

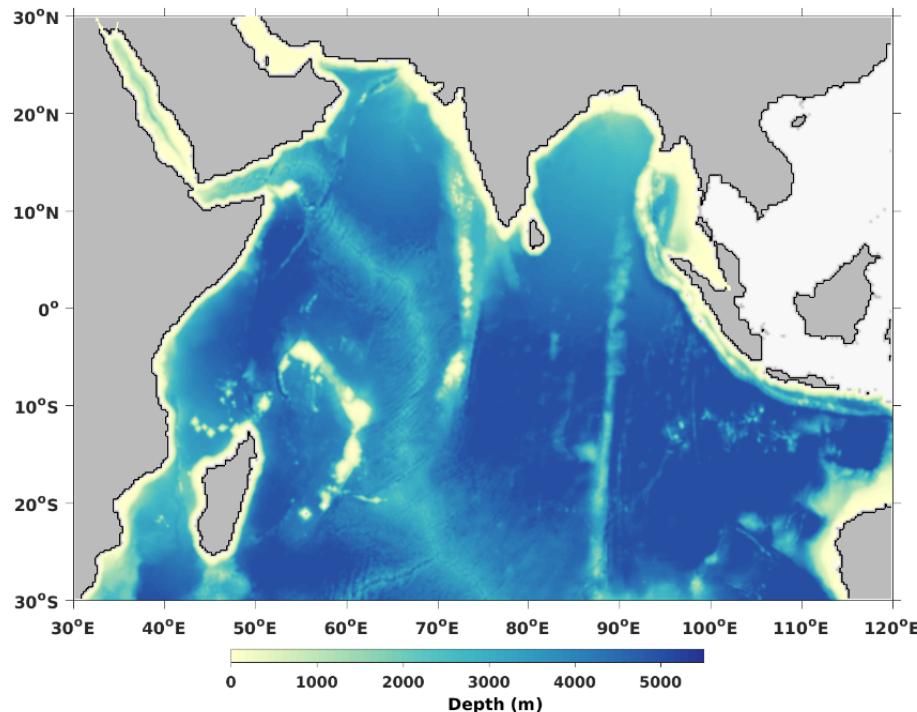
### **Acknowledgements:**

S. Sivareddy, Balaji B., Biswamoy Paul, D.S.Banerjee,  
Eugenia Kalnay, Steve Penny.

**ARYA PAUL  
INCOIS  
Hyderabad, India**

# Specifications

## Model Domain



**Model :: Regional Ocean Modeling System (ROMS)**

**DOMAIN:**

30°E to 120°E ; 30°S to 30°N

**RESOLUTION:**

1/12° (Horizontal)

40 sigma levels (Vertical)

**BOUNDARY CONDITIONS:**

Derived from INCOIS-GODAS.

**ATMOSPHERIC FLUX:**

NCMRWF flux from GFS model.

**Assimilation Scheme :: Local Ensemble Transform Kalman Filter (LETKF)**

**No. of Ensembles :: 80**

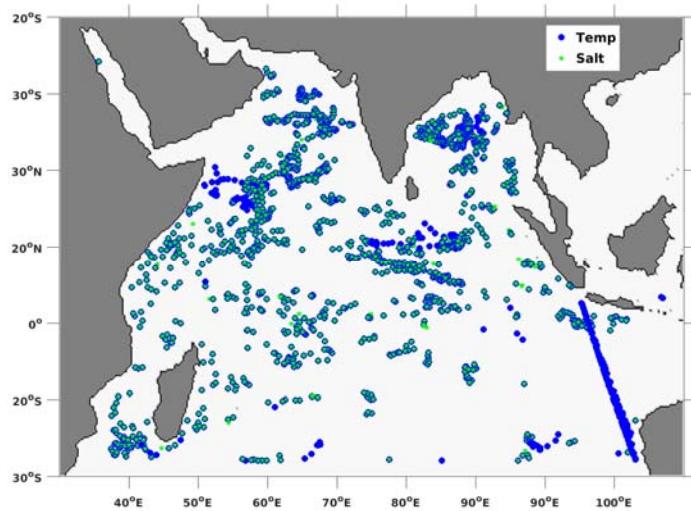
# Observations

## Assimilated Variables

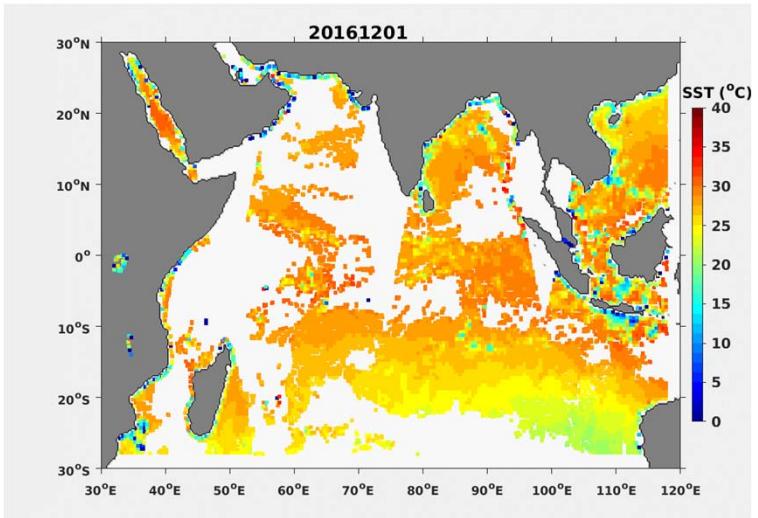
1. In-situ Temperature
2. Salinity Profiles
3. Sea Surface Temperature

## Independent Variables

1. Sea Level Anomaly
3. U,V Currents



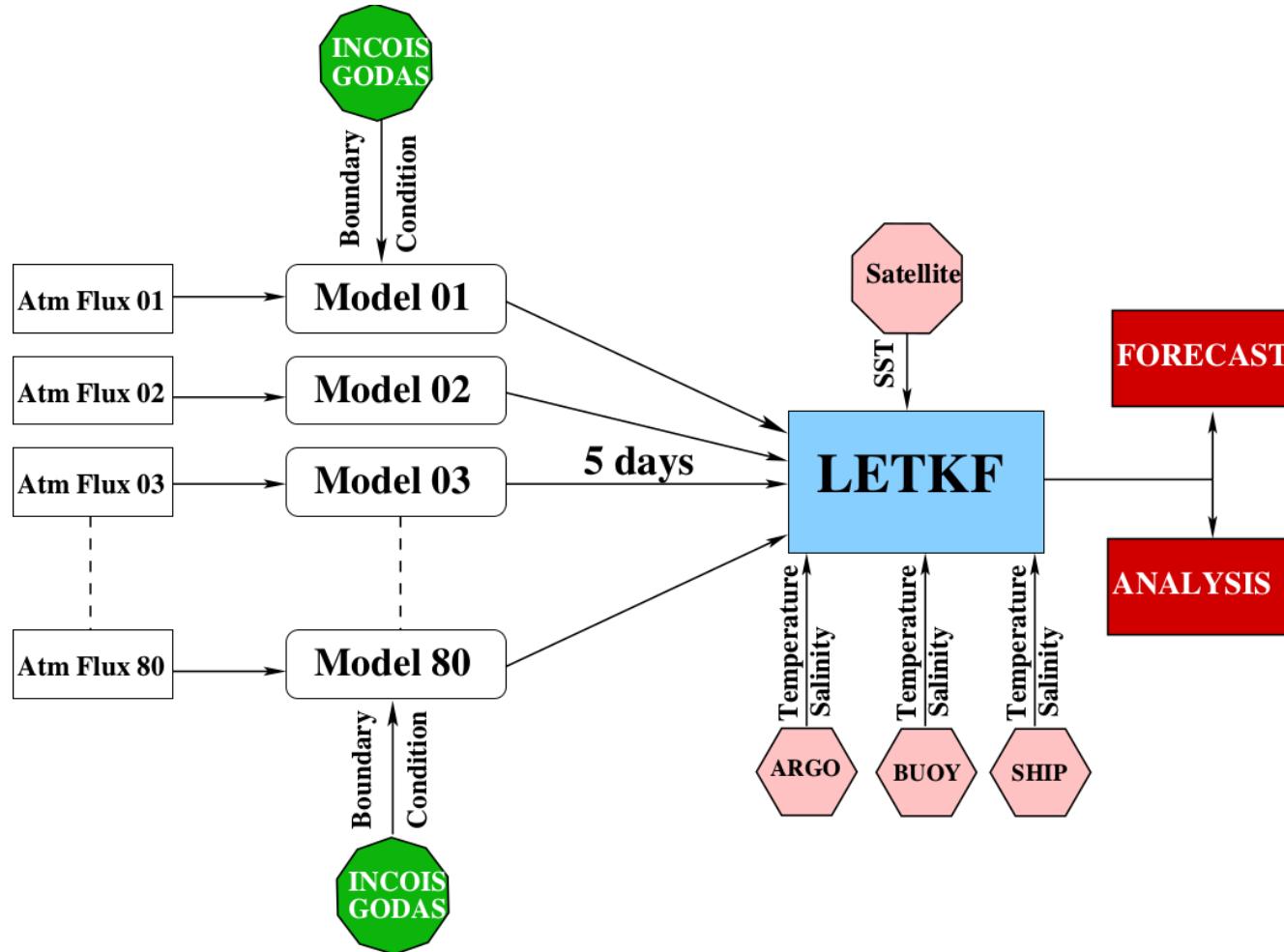
Spatial Distribution of Assimilated Observations (Temp and Salinity) for Aug 2016- Aug 2017



Assimilated satellite track SST over Indian Ocean for Dec 2016

# LETKF-ROMS

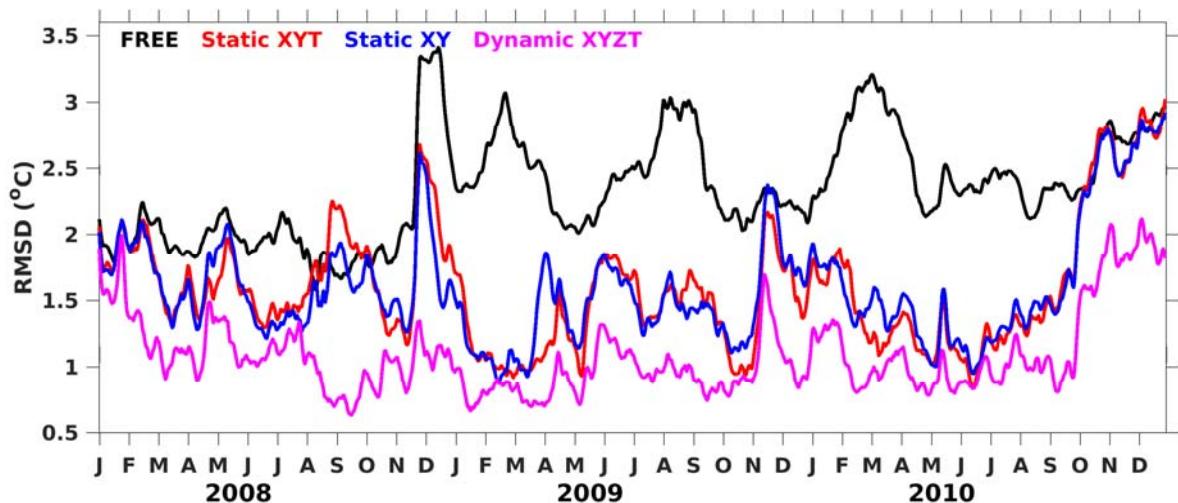
## Pictorial Illustration of the system



# What's new in this system ?

## Introduction of spatio-temporal Representational Error

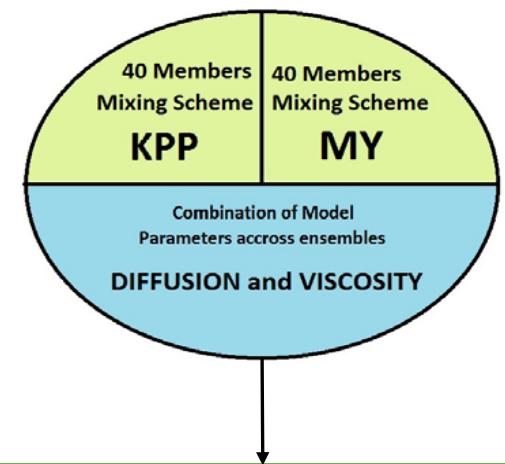
Time Series of RMSD in SST



Impact of dynamical representational errors on an Indian Ocean ensemble data assimilation system, Siva Reddy et al,

Quarterly Journal of Royal Meteorological Society, 2019. DOI: 10.1002/qj.3649

## Introduction of two mixing schemes across ensembles

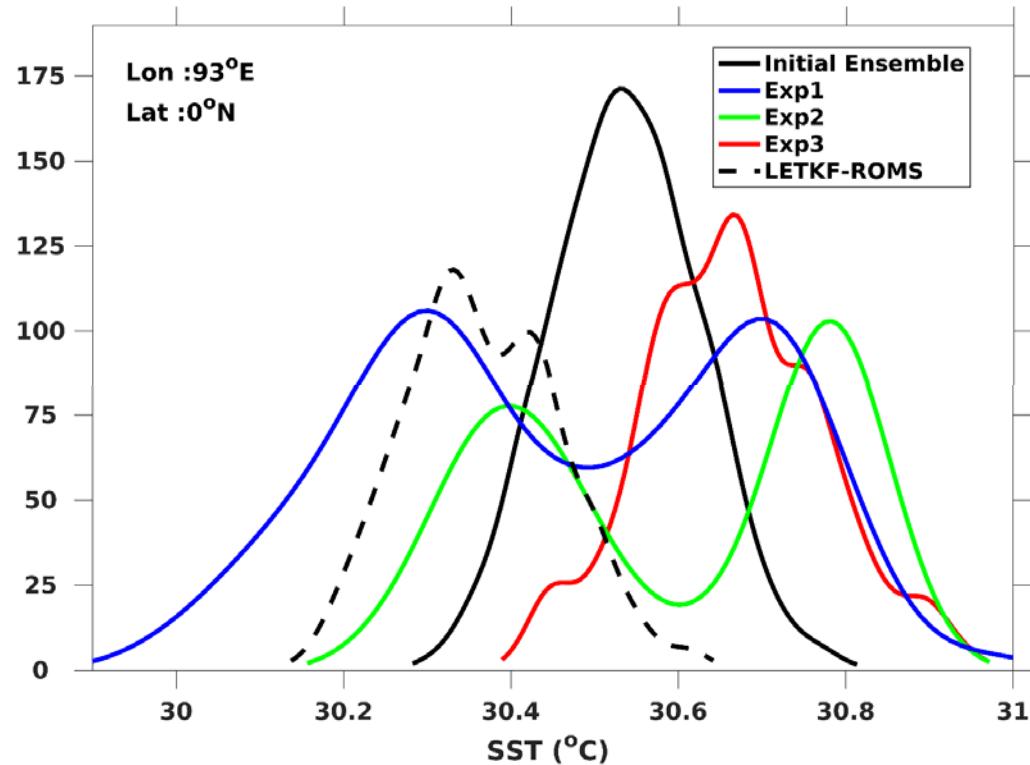


Ensemble combination with use of two mixing schemes and model parameters like diffusion and viscosity coefficients

Ensemble based regional ocean data assimilation system for the Indian Ocean: Implementation and evaluation, Balaji et al, Ocean Modeling, 2019, <https://doi.org/10.1016/j.ocemod.2019.101470>

# Disadvantages of two mixing scheme

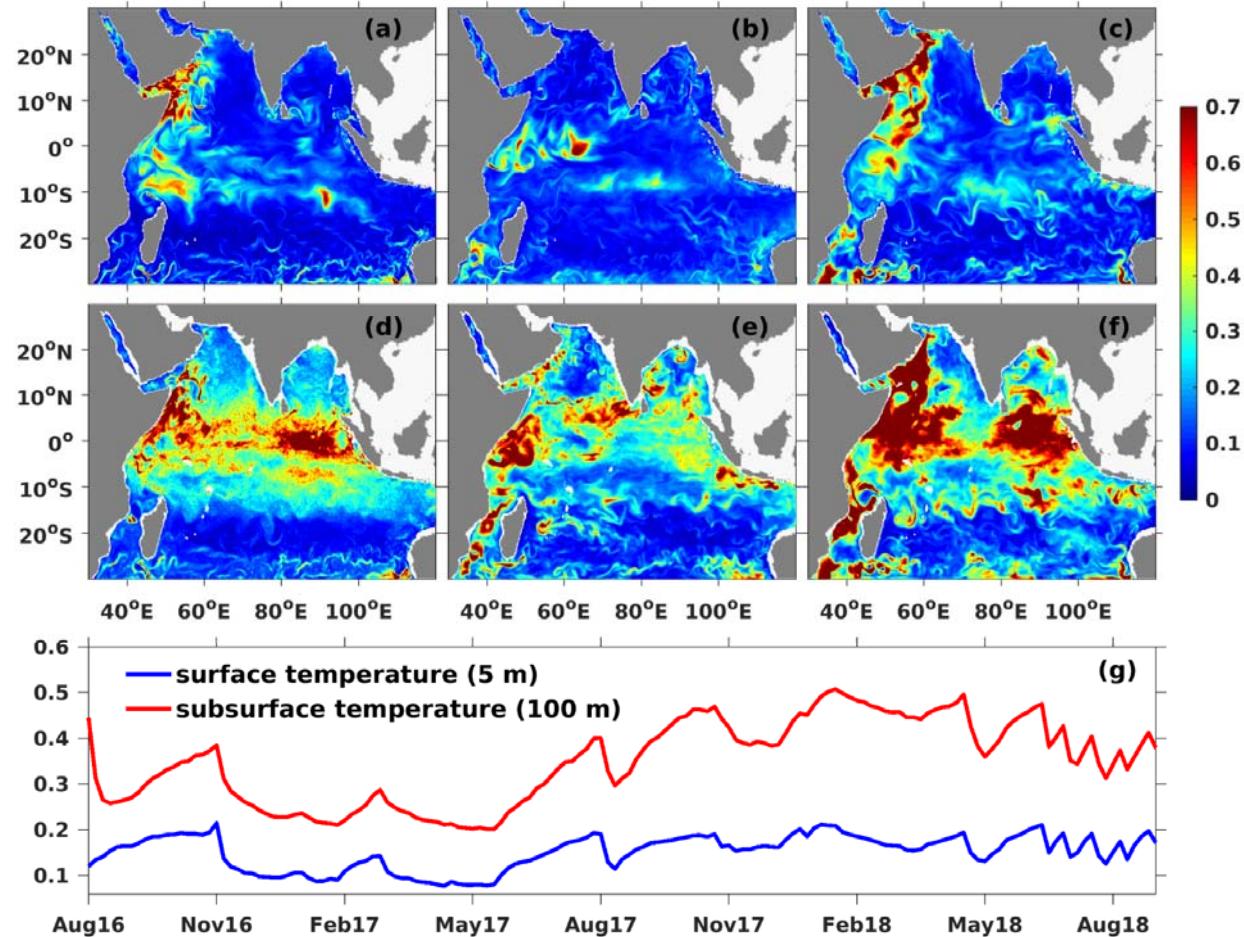
## SST distribution across the ensemble members



**LETKF-ROMS :** 80 ens members driven by 80 fluxes;  
KPP in 40 members & MY in 40.  
**Exp 1:** Same as LETKF-ROMS (no assim); ensemble flux  
**Exp 2:** Same as LETKF-ROMS (no assim); identical flux  
**Exp 3:** Same as exp 1; all ensemble members respond  
to KPP

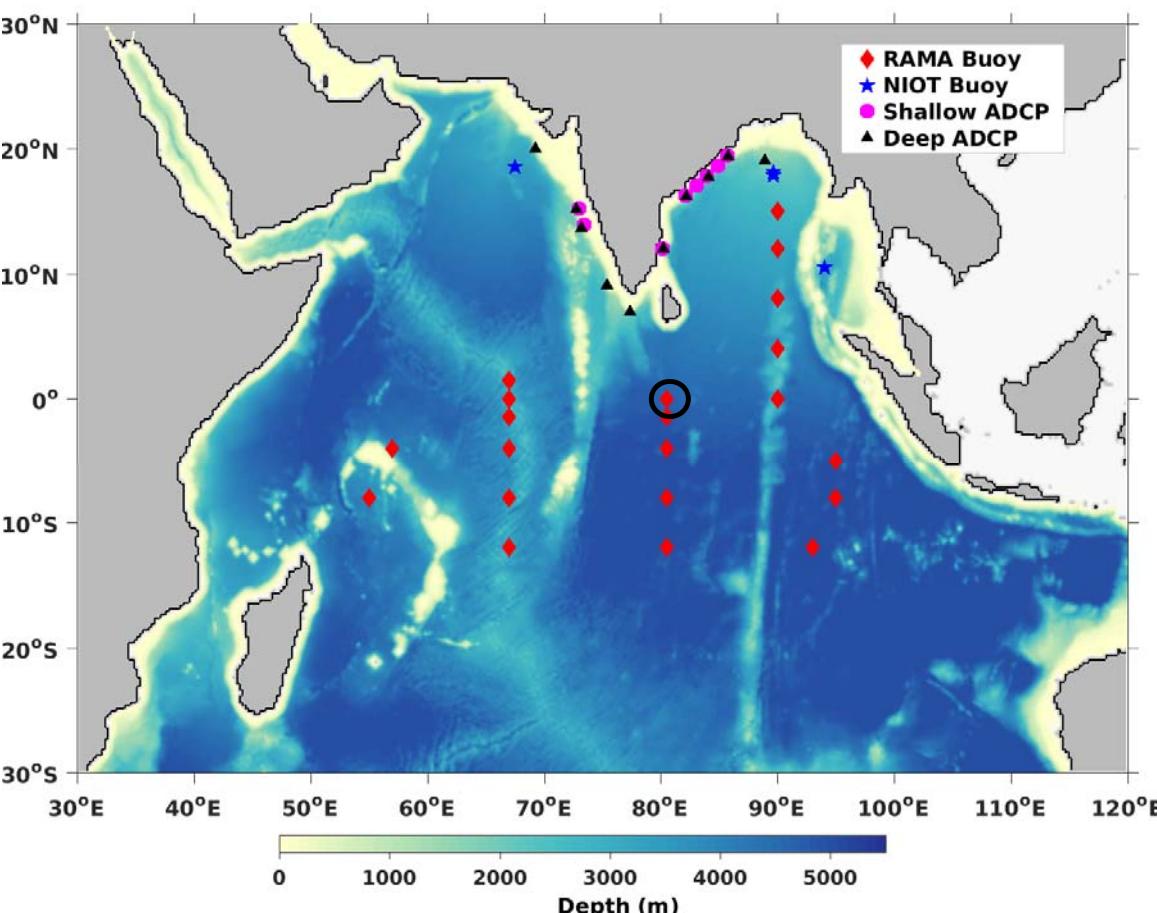
Initial ensemble (black) and after 600 days of run of three control experiments  
(exp1 — blue, exp2 — green and exp3 — red) and LETKF-ROMS (dashed black)

## Ensemble spread

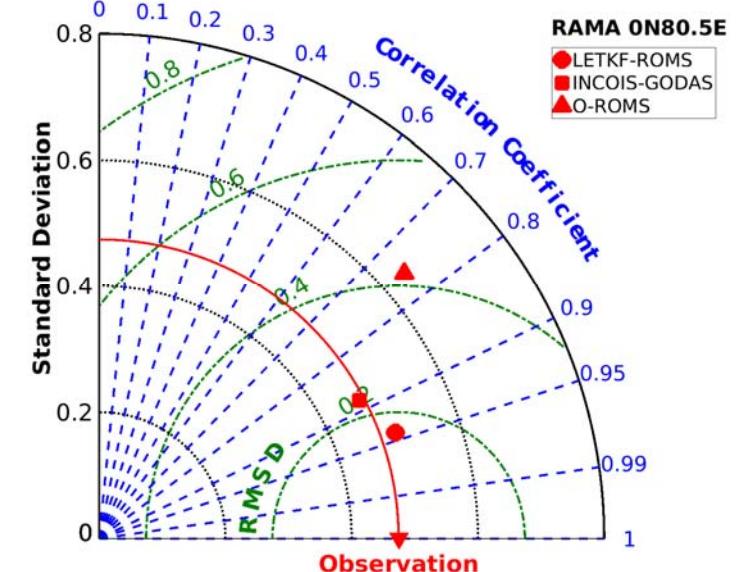


Spatial ensemble spread on 1st September 2016, 1st March 2017 and 1st September 2017 of the surface (5 m) temperature ((a), (b) and (c) respectively) and subsurface (100 m) temperature ((d), (e) and (f) respectively).  
(g) Domain-averaged time series of spread in temperature at 5 m (blue) and 100 m (red) depth.

## Analyses



**Location of in-situ observations (RAMA, NIOT, ADCP) used for comparison and validation of the analysis**

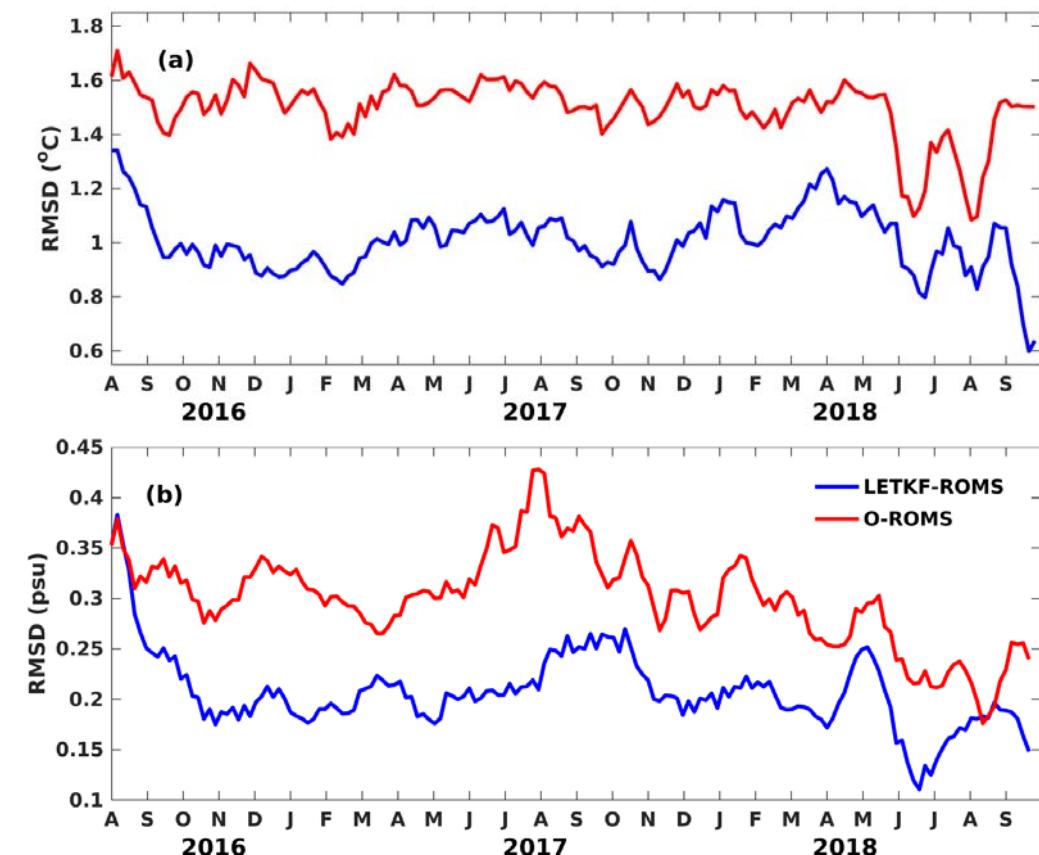


**Taylor Diagram of SST from LETKF-ROMS, INCOIS-GODAS and O-ROMS with respect to RAMA**

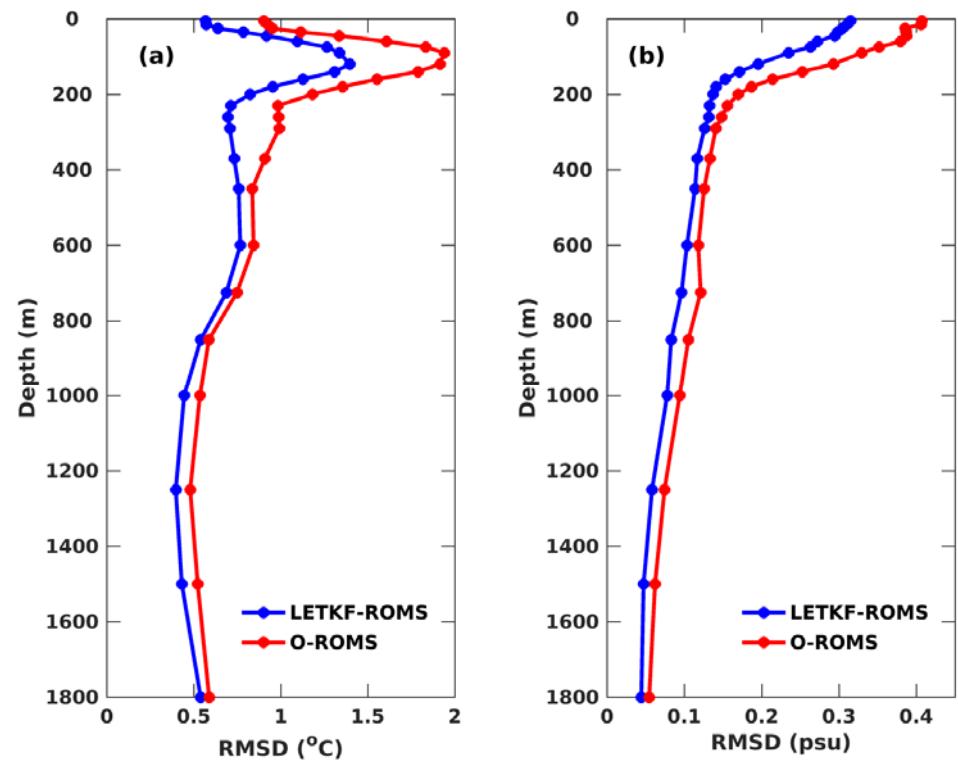
Comparisons at all locations is available in Technical Report.  
(Balaji et al., 2018)  
[http://www.incois.gov.in/documents/TechnicalReports/ESSO-INCOIS-MDG-TR-03 \(2018\).pdf](http://www.incois.gov.in/documents/TechnicalReports/ESSO-INCOIS-MDG-TR-03%20(2018).pdf)

# Temperature and Salinity Analysis

RMSD time series of (a) temperature and (b) salinity



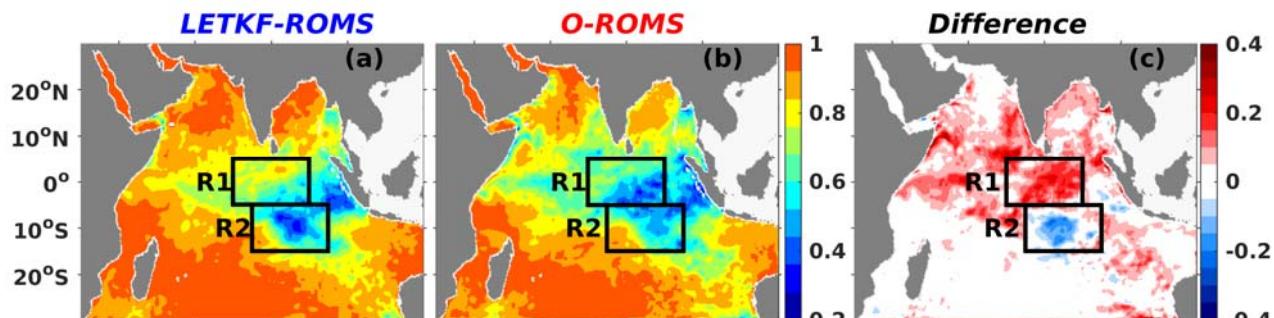
RMSD Vertical profile of (a) temperature and (b) salinity



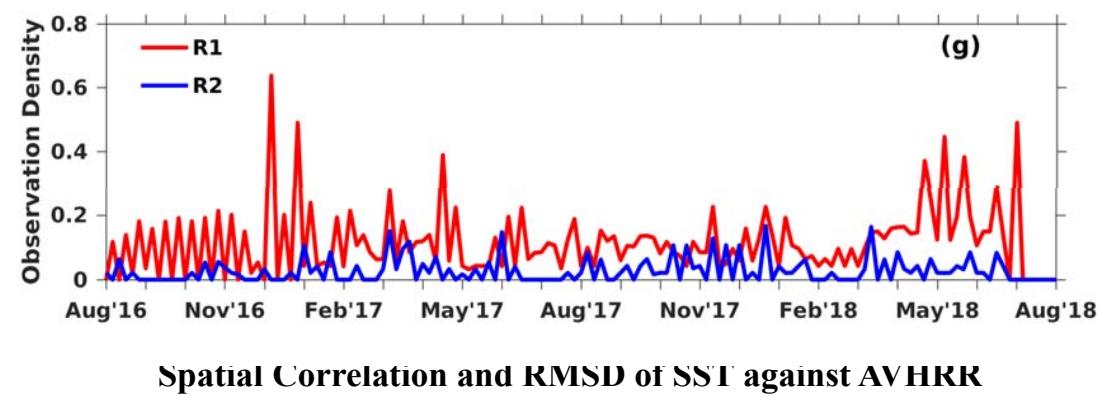
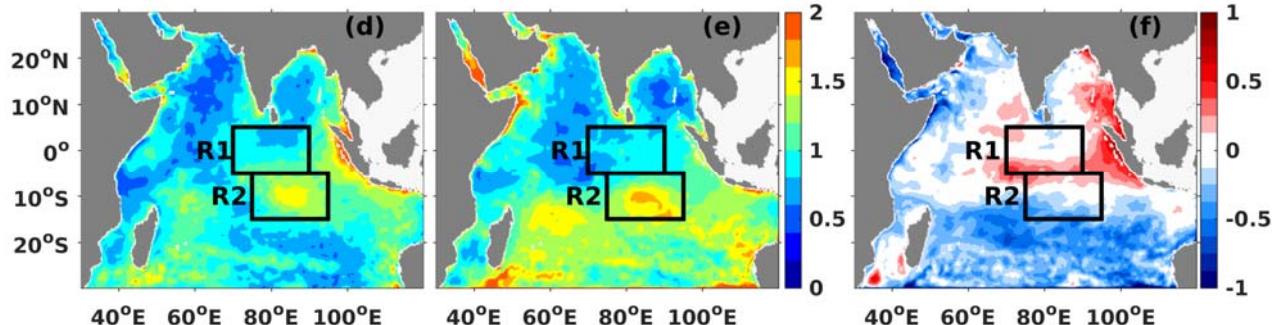
(Balaji et al., Ocean Modeling 2019)

## SST Analysis

Correlation

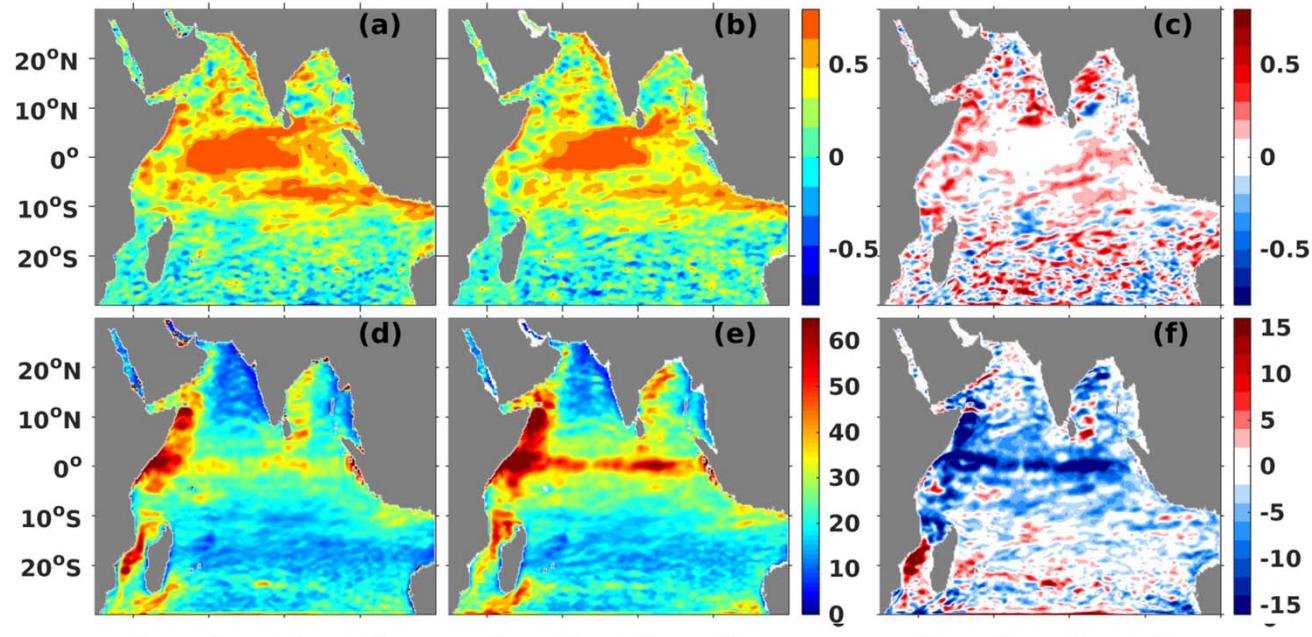


RMSE

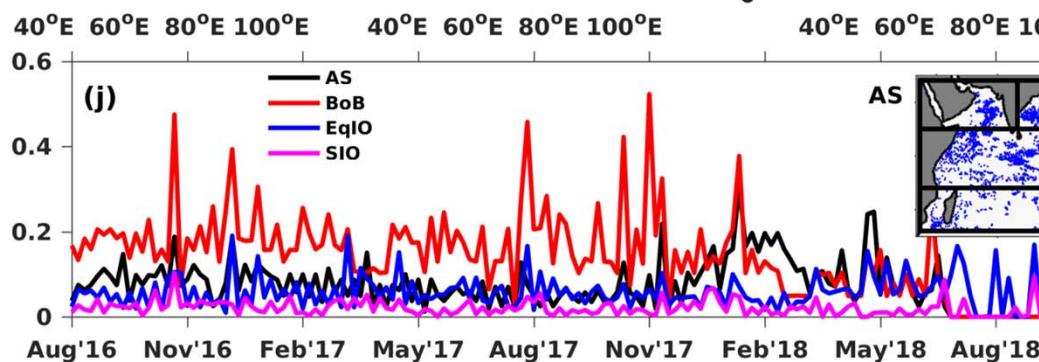


# Zonal Current Analysis

Correlation

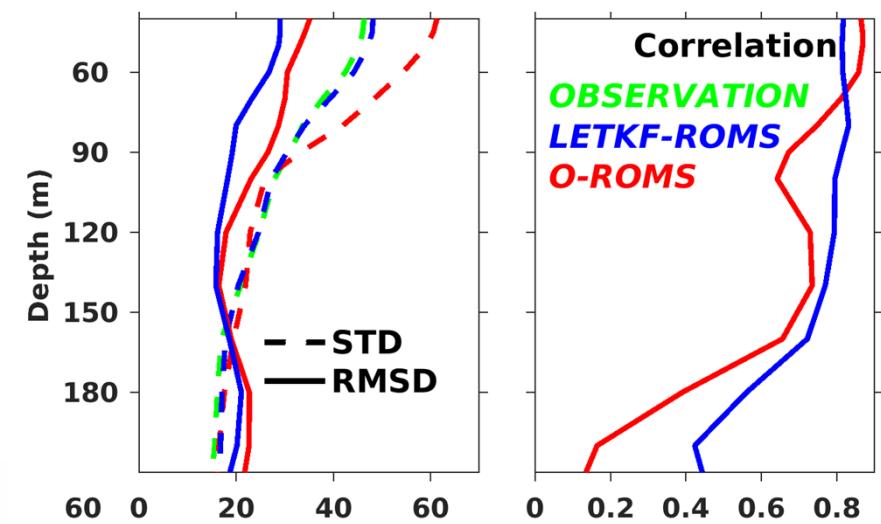
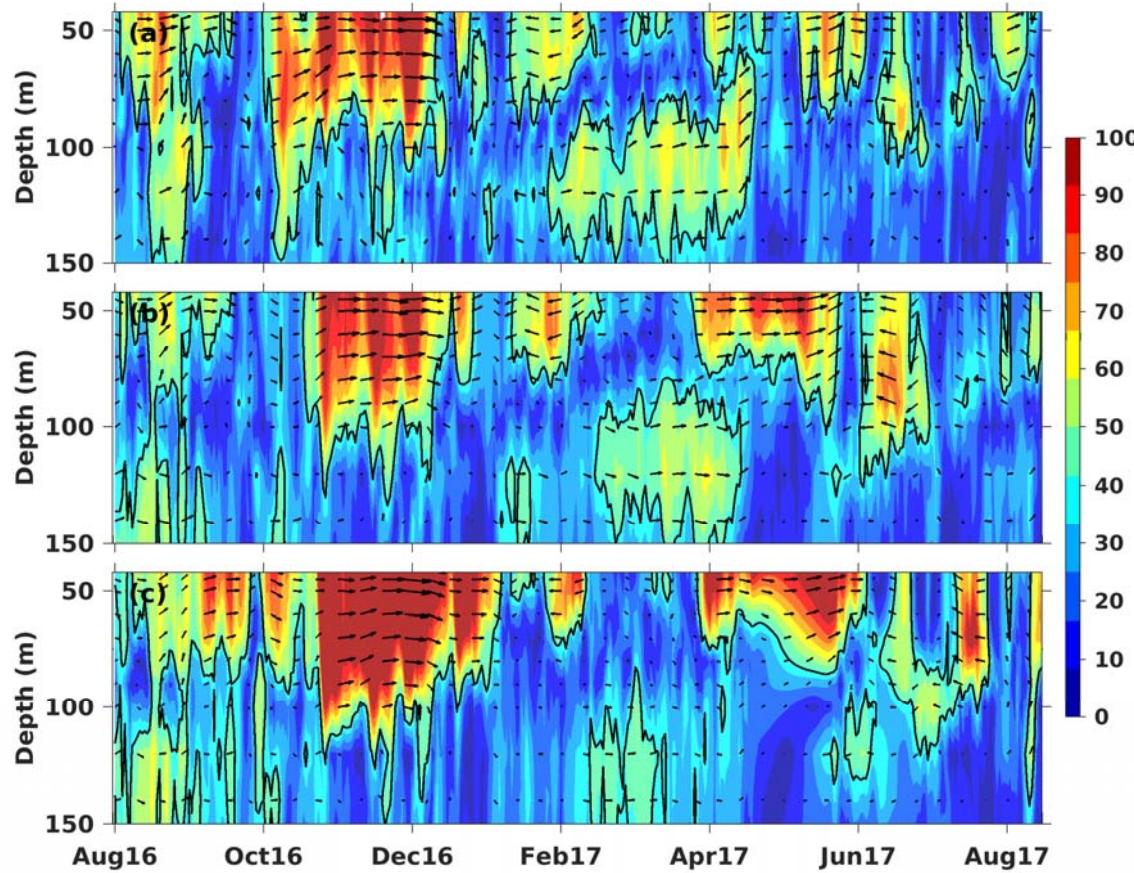


RMSE



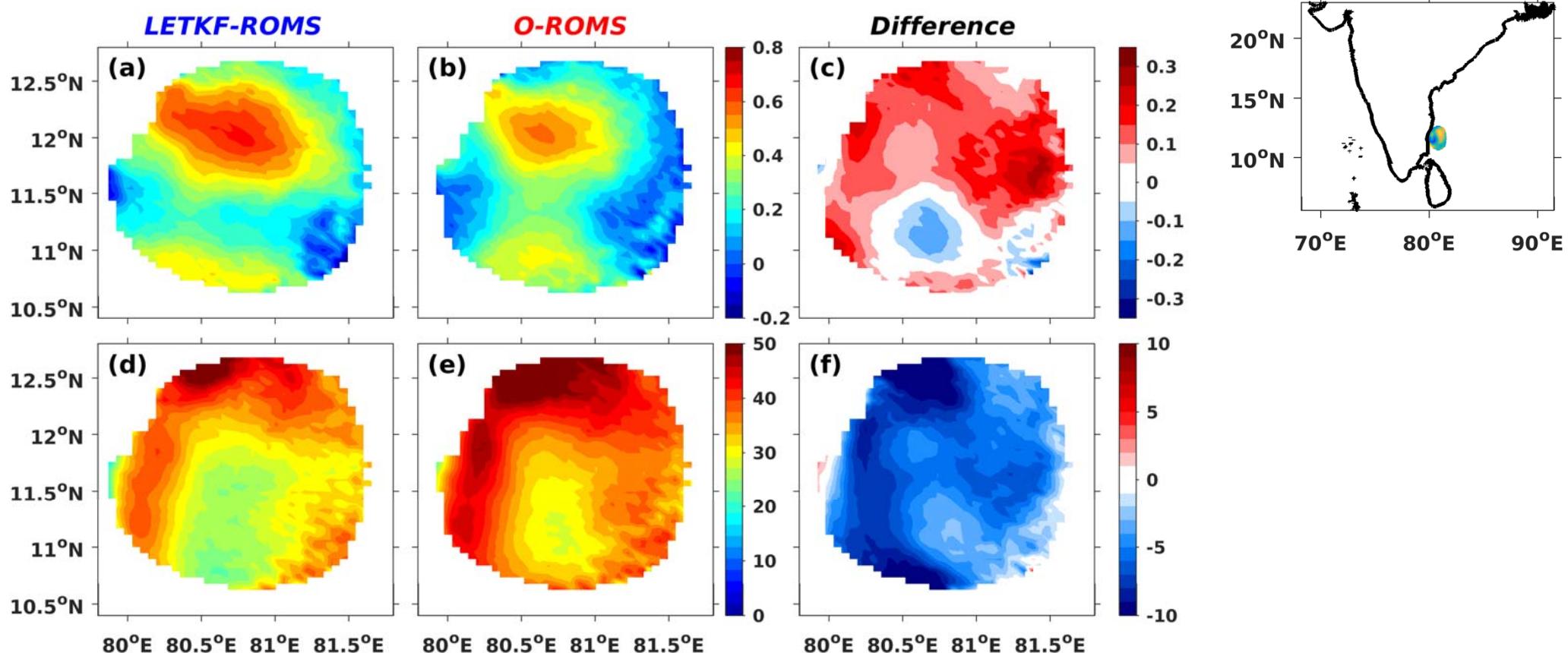
Spatial Correlation, RMSD of Zonal Current against OSCAR

## Zonal Current Analysis



Time-depth evolution of currents at Equator,  $80.5^{\circ}$  E from (a) ADCP,  
(b) LETKF-ROMS and (c) O-ROMS.

## Current Analysis



**Spatial Correlation and RMSD of Meridional Currents  
against HF Radar observations on East Coast of India**

## Summary

- An ensemble kalman filter based data assimilation is implemented using LETKF in  $1/12^{\circ}$  X  $1/12^{\circ}$  ROMS.
- This system comprises of 80 ensemble members.
- It assimilates in-situ temperature and salinity profiles and satellite track SST.
- The ensemble members are tweaked to maintain healthy spread.
- The assimilation showed significant improvement in estimation of tracers as well as independent variables.
- The most profound improvements were seen in currents whose observations were not assimilated.
- RMSE in currents is reduced by 5 cm/s over entire domain and 15cm/s in Equatorial IO and East Coast of Africa.
- LETKF has shown better predictability of surface and subsurface currents.

## Things to worry about:

- LETKF-ROMS is computationally expensive compared to FREE-ROMS.
- LETKF-ROMS requires periodic checks as the Ensemble system ideally works for Gaussian distributed ensemble members.

## References

- Balaji, B., Deepsankar, B., Paul, B., Sanikommu Sivareddy, P.A. Francis, Abhisek Chatterjee, and Arya Paul (2018). LETKF-ROMS: An improved predictability system for the Indian Ocean. Technical Report, ESSO-INCOIS-MDG-TR- 03, available at <http://moeseprints.incois.gov.in/id/eprint/4572>.
- Balaji, B., Biswamoy Paul, Deep Sankar, B., Sivareddy, S., Arya Paul. 2019. Ensemble based Regional ocean data assimilation system for the Indian Ocean: Implementation and Evaluation. *Ocean Modelling*.
- Sivareddy, S., Deep Sankar, B., Balaji, B., Biswamoy Paul, Arya Paul, Kunal Chakraborty, Ibrahim Hoteit. 2019. Impact of Dynamical Representational Errors on an Indian Ocean Ensemble Data Assimilation System. *Quarterly Journal of the Royal Meteorological Society*.

**THANK YOU**