

# Development of Four-Dimensional Local Ensemble Transform Kalman Filter (4D-LETKF) for the Coastal Ocean

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## Abstract

**Goal:** Building of a robust and efficient data assimilation (DA) system for the U.S. West Coast ocean:

1. routinely provide the analysis and forecast of the ocean state along with their uncertainties
2. easily assimilate unconventional observations and implement additional features
3. be portable/relocatable to other parts of the ocean as the regions of interest may change over time

**Choice of primary elements for a robust DA system:**

- |                 |                          |
|-----------------|--------------------------|
| 1. Model        | ROMS                     |
| 2. Observations | Remote-sensing & In situ |
| 3. DA method    | 4D-LETKF                 |

**Advantage (a):** Model and observation setup.

A 3D-Var DA system has been successfully implemented in ROMS and is working in real-time (Li et al., 2007a).

## DA Method 1: Ensemble Kalman Filter (EnKF)

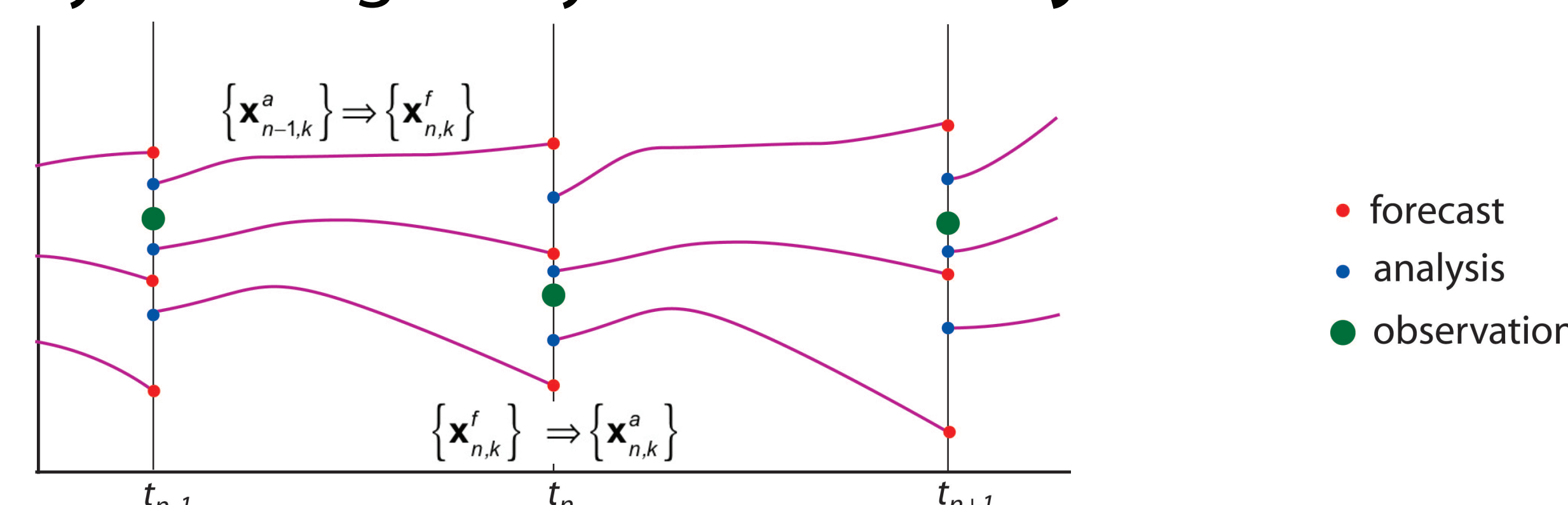
**Use of ensemble,  $\{\mathbf{x}_{n,k}\}$ ,  $k=1, \dots, L$ :**

Probability distribution of the  $N$ -dimensional state  $\mathbf{x}_n$

**EnKF procedure:** Iteration of 2-step cycles

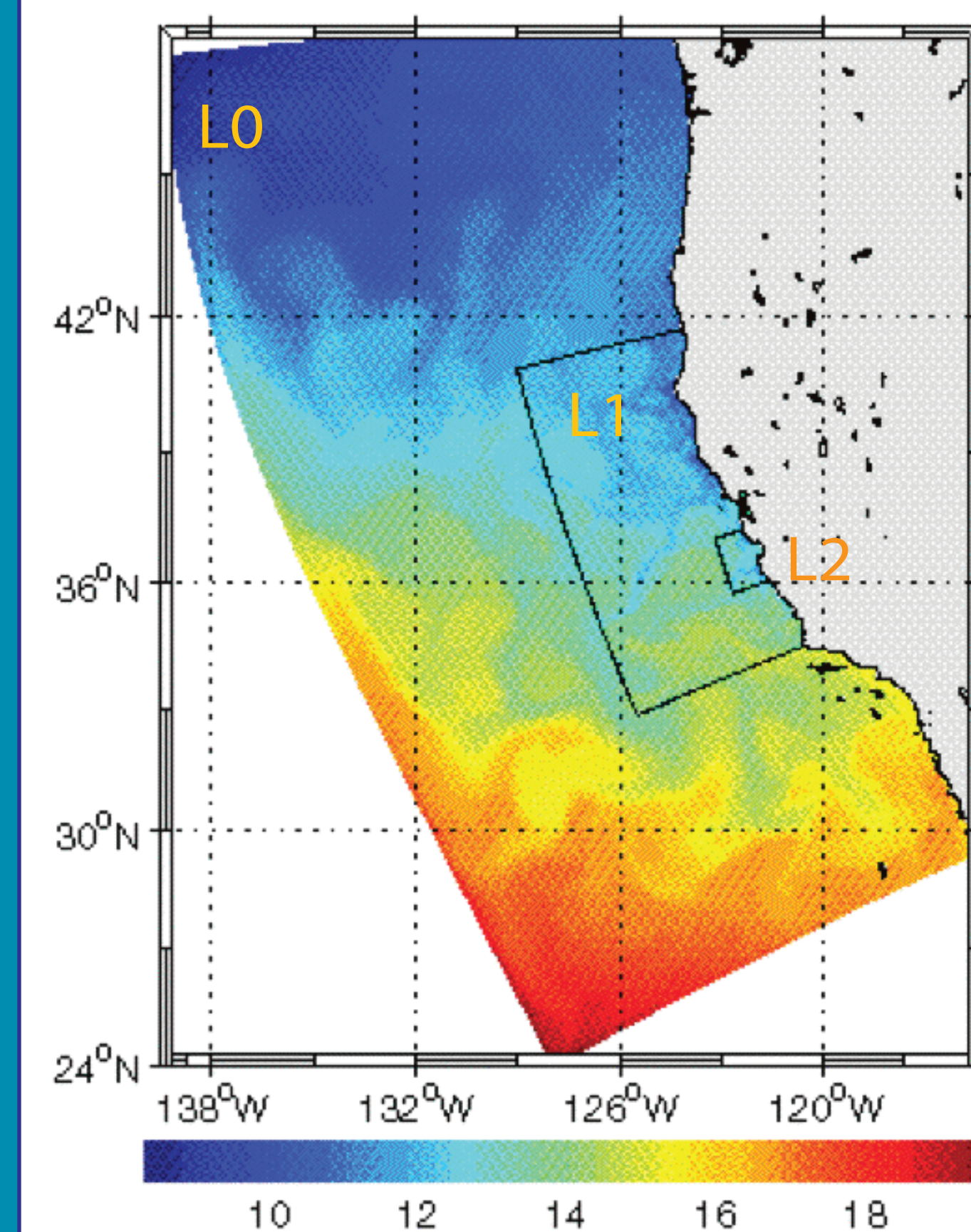
1. Ensemble forecast from  $t_{n-1}$  to  $t_n$ :
2. Analysis using noisy observation  $\mathbf{y}_n^o$  at  $t_n$ :

$$\begin{aligned} \{\mathbf{x}_{n-1,k}^a\} &\Rightarrow \{\mathbf{x}_{n,k}^f\} \\ \{\mathbf{x}_{n,k}^f\} &\Rightarrow \{\mathbf{x}_{n,k}^a\} \end{aligned}$$



**Advantage (e):** Flow-dependent (time-evolving) Information of uncertainties by the ensemble

## Model: Regional Ocean Modeling System (ROMS)



**State vector  $\mathbf{x}_n$  and dynamics  $\mathbf{m}_{n,n-1}$ :**

$$\mathbf{x}^T = (\dots, T_{ij}, S_{ij}, u_{ij}, v_{ij}, \dots, \zeta_{ij}, \dots)^T$$

$$\mathbf{x}_n = \mathbf{m}_{n,n-1}(\mathbf{x}_{n-1})$$

**Configuration:**

- Multi-level one-way nesting
- L0(15km), L1(5km), L2(1.5km)
- Atmospheric forcing by COAMPS

**Advantages:**

- (b) Portability by nesting
- (c) Existing short-term predictive skill (Li et al., 2007b)

## DA Method 2:

### 4-D Local Ensemble Transform Kalman Filter (LETKF)

**Unique Features:**

1. Analysis is performed locally at each model grid point, to address the issues common to EnKF methods
  - rank deficiency due to limited ensemble size ( $K \ll N$ )
  - intense algebraic computations
2. Assimilation of asynchronous observations taken at intermediate times during one cycle.

**Advantages:**

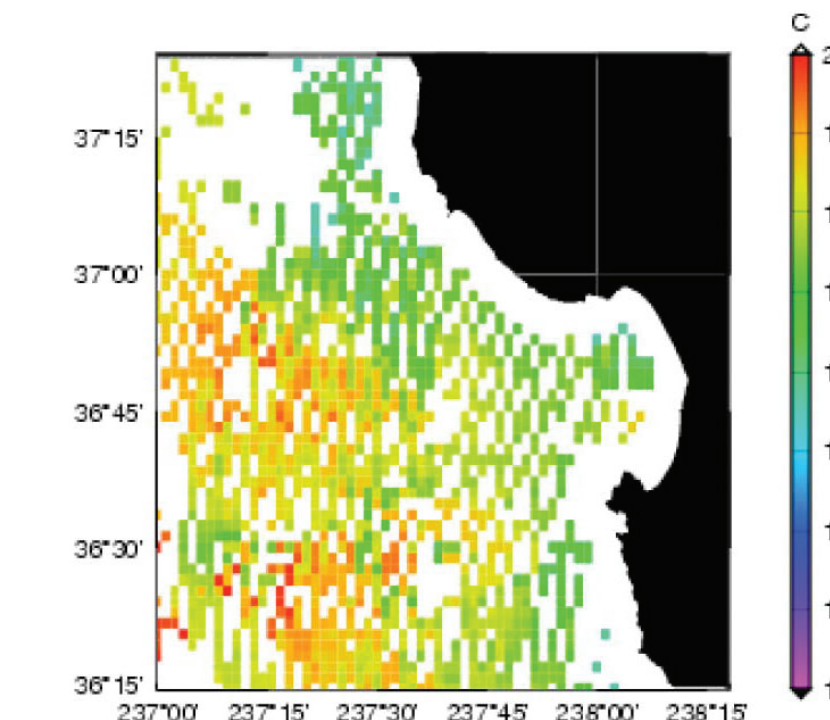
- (f) Practical handling of nonlinear, spatiotemporal phenomena by local analysis (Hunt et al., 2007)
- (g) Efficiency by parallelization in both forecast and analysis (Hunt et al., 2007)
- (g) Accuracy by local and asynchronous analysis, in particular data-poor regions (Szunyogh et al., 2007).
- (h) portability by design of computational algorithm

## Observations:

**Observation vector  $\mathbf{y}_n$  and operator  $\mathbf{h}_n$ :**  $\mathbf{y}_n = \mathbf{h}_n(\mathbf{x}_n)$

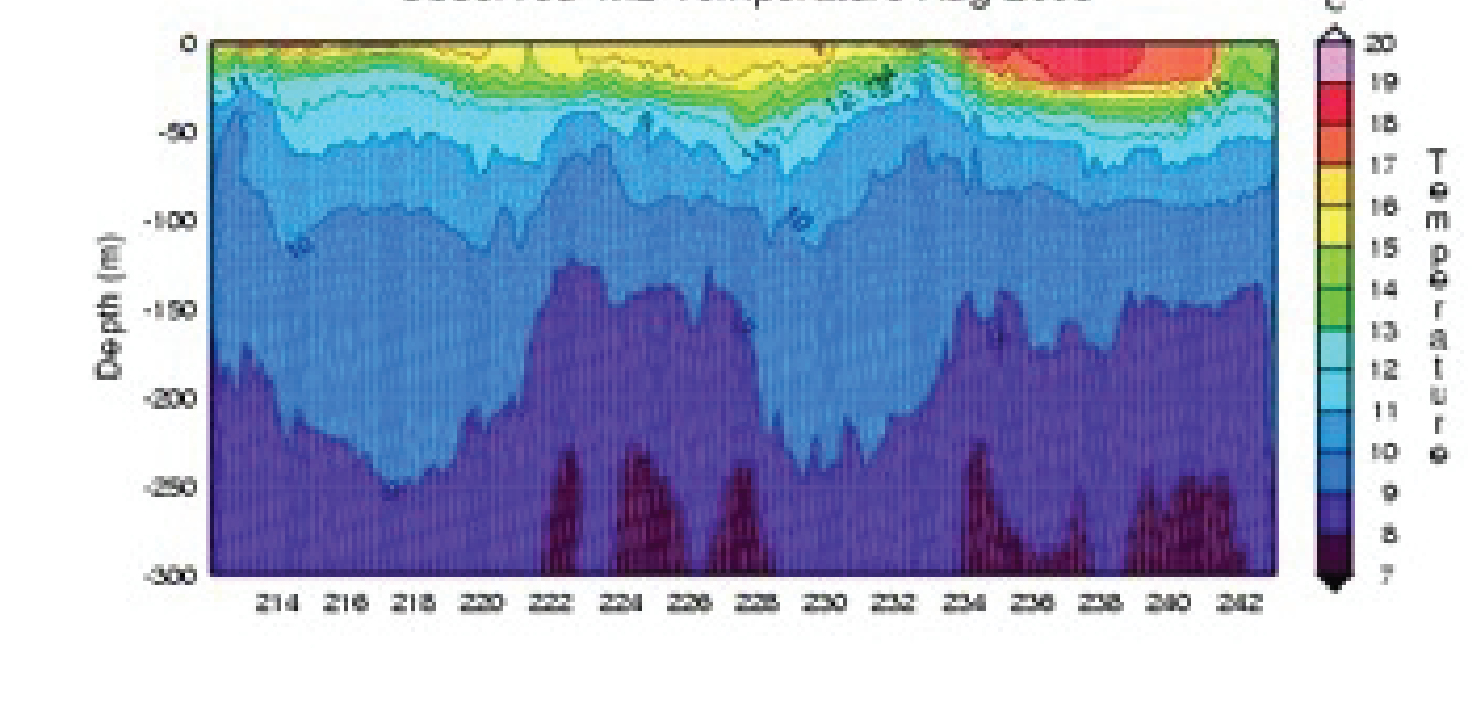
**Remote-sensing**

AVHRR SST 4-6 Aug 2003



**In situ**

Observed M2 Temperature Aug 2003



Type	Platform	No/day
SST	Remote-sensing	Satellite
SSH	Remote-sensing	Satellite
T & S	In situ	Mooring

Type and number of current routine observations for the ROMS 3D-Var DA system.

**Advantage (d):** New types and increasing number of coastal ocean observations, partly by the Integrated Ocean Observing System (IOOS)

## Concluding Remarks

**The ROMS 4D-LETKF system:** An ideal DA system by taking full advantage of the state-of-art ocean model and the advanced atmospheric DA method.

**Future development:** Including

1. feature tracking for eddies and fronts
2. adaptive sampling and observing system design
3. Lagrangian analysis tool for surface and 3D tracer fields

## References

- Hunt, B.R., E.J. Kostelich, and I. Szunyogh, 2007, Efficient data assimilation for spatiotemporal chaos: A local ensemble transform Kalman filter, Physica D.
- Li, Z., Y. Chao, J.C. McWilliams, K. Ide, 2007a&b, A three-dimensional data assimilation scheme for the regional ocean modeling system, JAOT, submitted; A three-dimensional data assimilation scheme for the regional ocean modeling system: Implementation and basic experiments, JGR, accepted.
- Szunyogh, I. and co-authors, 2007: A local ensemble transform Kalman filter data assimilation scheme for the NCEP global model, Tellus, accepted.