# Reconstruction of the Long-Term Satellite-Derived Sea Surface Temperature in the South China Sea

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#### Abstract

The AVHRR (Advanced Very High Resolution Radiometer) sea surface temperature is very useful for researches in oceanography because of its high resolution. An AVHRR limitation is the high missing data percentage due to cloud coverage. In the South China Sea, the average missing data is usually more than 80%, especially more than 95% in the region near the Borneo Island. In this study, we use DINEOF tool to reconstruct a daily night-time AVHRR data set with horizontal resolution of 4km spanning from 1989 to 2009. Besides, a comparison between the results and in situ data is shown. The EOF analysis shows that the first three modes explain about 95% of seasonal variability.

#### **DINEOF**

To reconstruct cloud-covered satellite images, we use DINEOF (**D**ata **IN**terpolating **E**mpirical **O**rthogonal **F**unctions) described in Beckers et al. (2003), Alvera-Azcárate et al. (2005). A filtering of the temporal covariance matrix is used following Alvera-Azcárate et al. (2009).

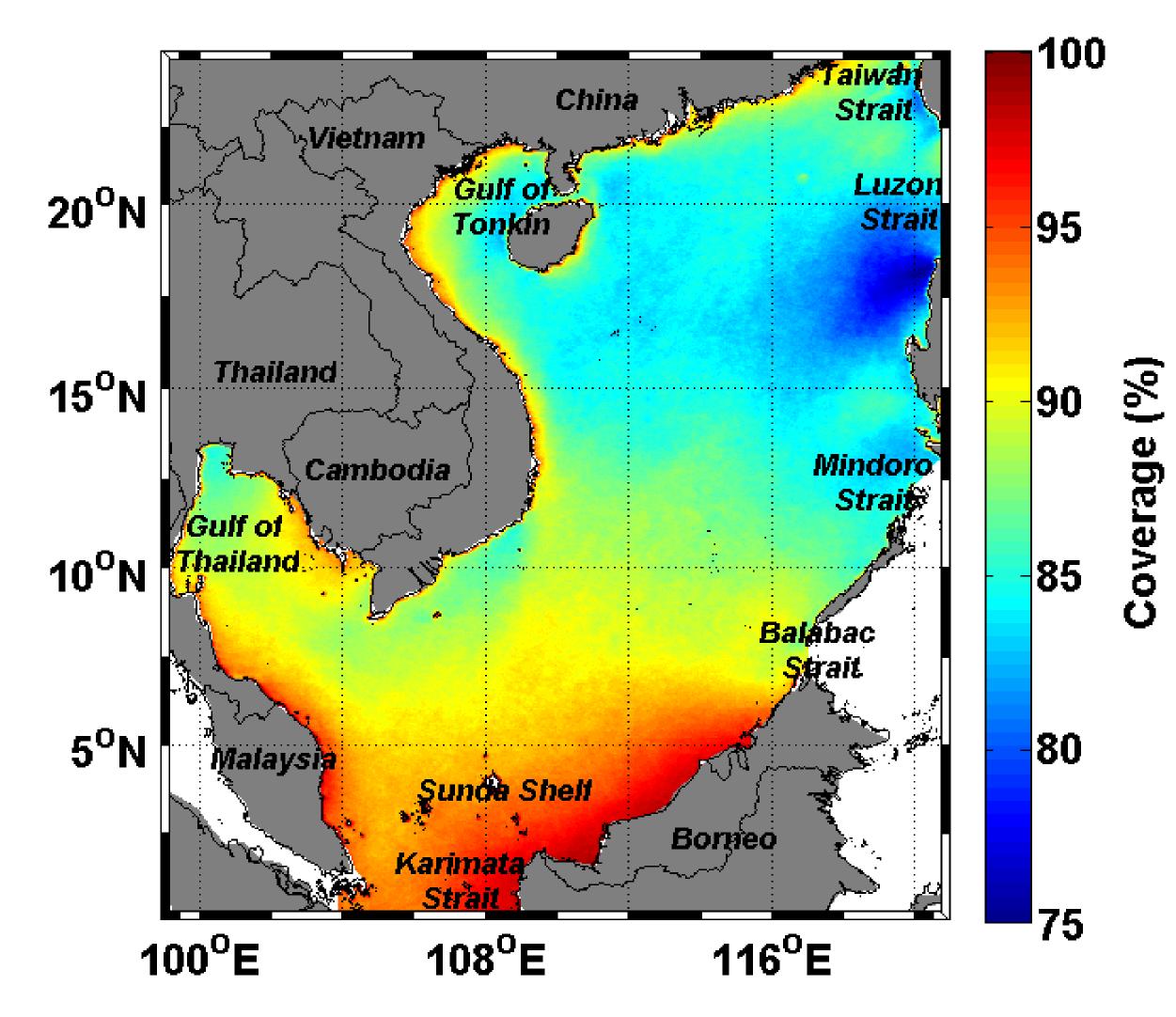
Firstly, the initial data input **X** is obtained by subtracting the temporal mean and setting the missing data to 0.

Secondly, a Singular Value Decomposition (SVD) of  $\mathbf{X}$  is performed, which is used to calculate the missing data by the equation:  $\mathbf{X}_{ij} = \sum_{p=1}^k \rho_p \left(\mathbf{u}_p\right)_i \left(\mathbf{v}_p^T\right)_i$ 

where i, j are temporal and spatial indexes, respectively, k is the number of EOFs modes, **u** and **v** are the pth spatial and temporal functions of EOF, and  $\rho_p$  is the corresponding singular value. Step 2 is repeated until

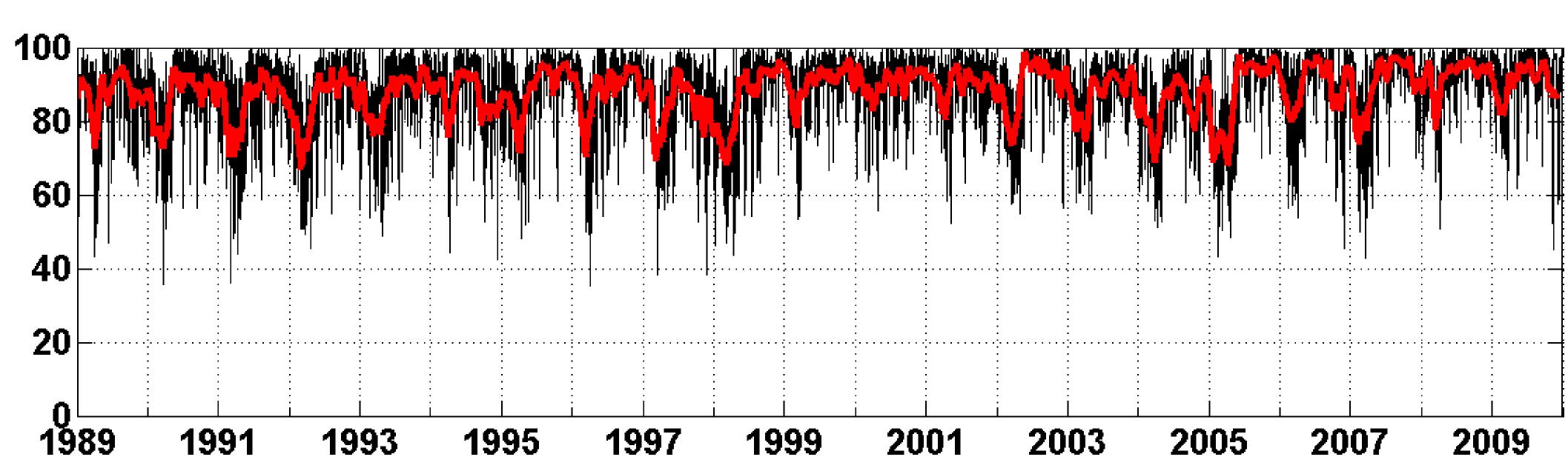
Thirdly, a cross-validation technique determines the optimal number of EOF modes retained in the reconstruction. Finally, the optimal number of EOFs is used to reconstruct the whole matrix.

## Data set



convergence is reached for the missing values.

An AVHRR SST data set spanning from 1989 to 2009 (7670 images) with horizontal resolution of 4km is used. Night-time data are used to avoid skin temperature problems. The percentage of missing data is very high in space and time. Average missing data is 88%. Only images containing at least 5% of data are used and pixels which are missing more than 95% of the time are masked as land points. The number of images is reduced to 5119 images (67% of the initial data), and the mean cloud coverage is about 82%.



**Figure 1.** Spatial (above) and temporal (below) variation of cloud cover over the South China Sea in 1989–2009. The percentage of missing data is high in summer, and especially from the equator to 5 °N.

## References

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Alvera-Azcarate, A., Barth, A., Sirjacobs, D., and Beckers, J.-M. 2009. Enhancing temporal correlations in EOF expansions for the reconstruction of missing data using DINEOF. Ocean Science, 5: 475-485.

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#### Results

DINEOF retained 33 optimal modes (99.37% of variability) to reconstruct the SST field, with expected error 0.46 °C.

The first three modes explain more than 95 % of seasonal variability. Mode 1 (69.44%) and 2 (24.91%) show the variability of the circulation following the northeasterly and southwesterly monsoon. Mode 3 (1.24%) explains the variability of the upwelling phenomenon in the northwest of the South China Sea and the centre of Vietnam in summer. Mode 4 contains 1% of variability, approximately that of mode 3, but its temporal pattern is not a clear seasonal cycle. The other modes only explain 2.78 % of variability and there are always pairs of modes having the same energy of variability.

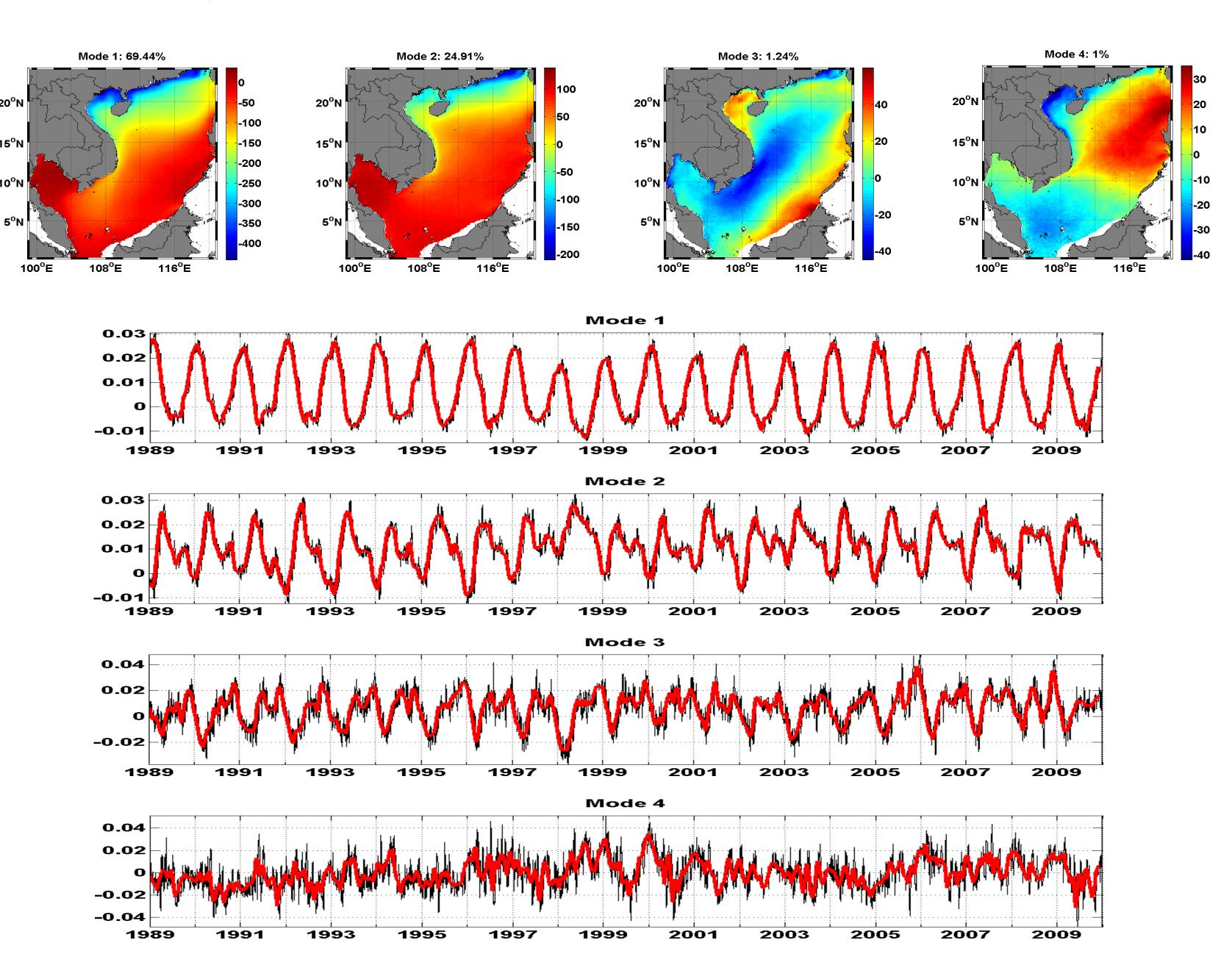


Figure 2. Spatial and temporal EOF of mode 1-4.

## Validation

An in situ data set (8034 data points) collected from 1989 to 2009 was used to validate the reconstructed SST (Figure 3). The root mean square error between the reconstructed data and the in situ data is 1.04 °C.

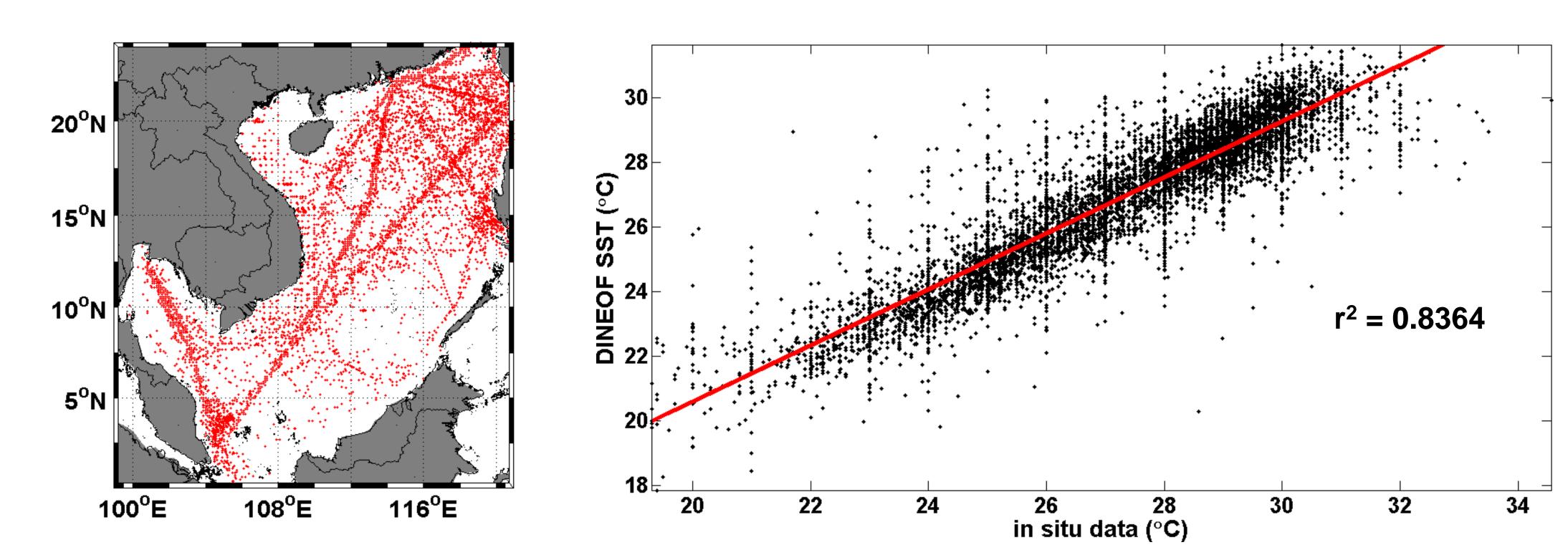
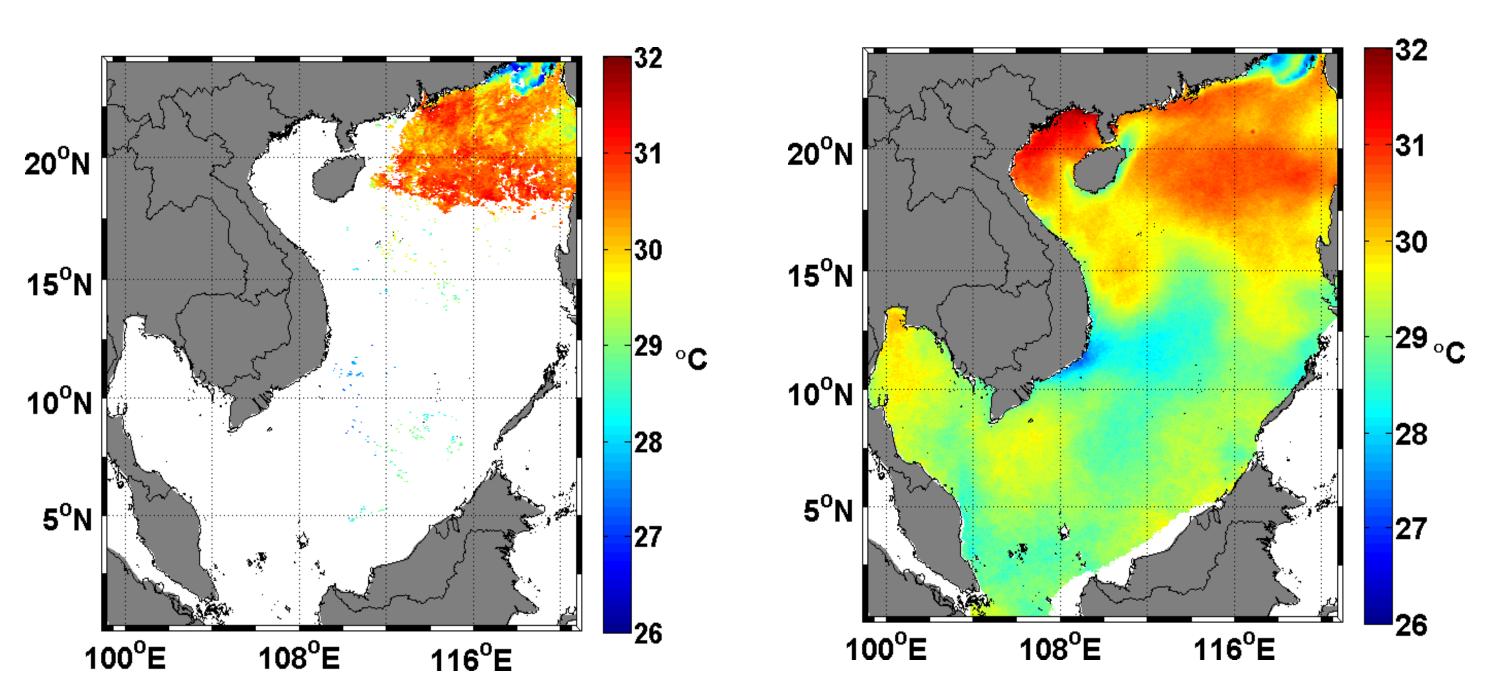


Figure 3. Position of data points (left) and comparison between the reconstructed SST by DINEOF and in situ data (right).

## Sample of reconstruction



**Figure 4.** SST (right) was reconstructed by DINEOF from an image with cloud coverage 85.89% (left) on 28 August 2009. The reconstructed SST clearly shows the upwelling phenomena in the northeastern South China Sea and in the center of Vietnam in summer.

## Acknowledgments

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