



ESA Climate Change Initiative Phase-II

Sea Surface Temperature (SST)

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Optimal Estimation of Sea Surface Temperature from AMSR-E

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Outline

- Motivation
- Multi-sensor matchup data base (MMD)
- Optimal estimation retrieval algorithm
- Performance
- Conclusion and way forward

Motivation

- Little European activity within the PMW SST retrieval work
- PMW SST retrievals are valuable supplement to IR SSTs due to the capability to see through clouds and small response to aerosols
- Optimal Estimation provides pixel-level information on the retrieval quality
- Optimal Estimation is currently being developed for Sea Ice within ESA CCI Sea Ice (SICCI) context
- A new PMW satellite (CIMR) is candidate for the Copernicus expansion mission

Multisensor Matchup Dataset (MMD6C)

- AMSR-E L2A TBs from RSS (NSIDC), version 7

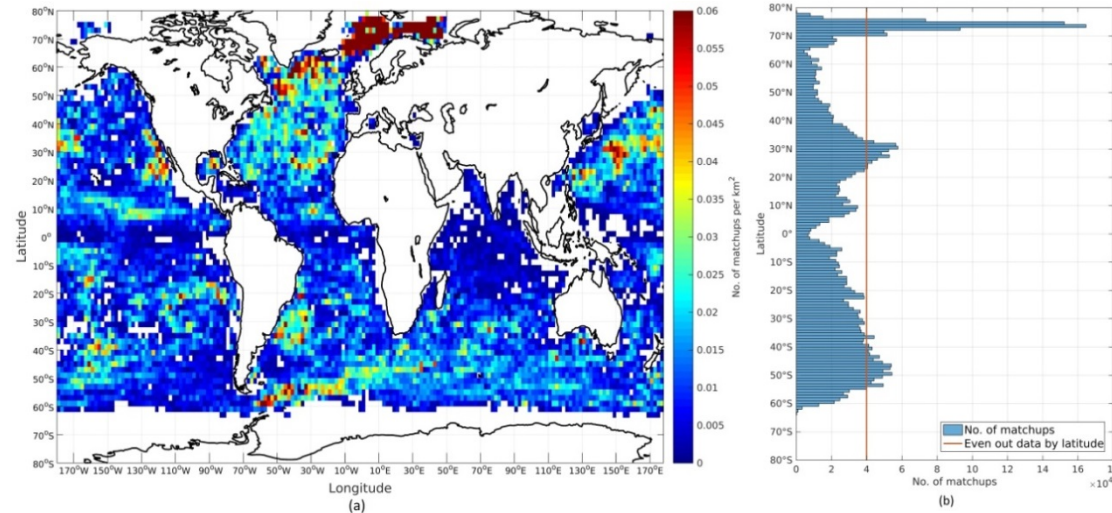
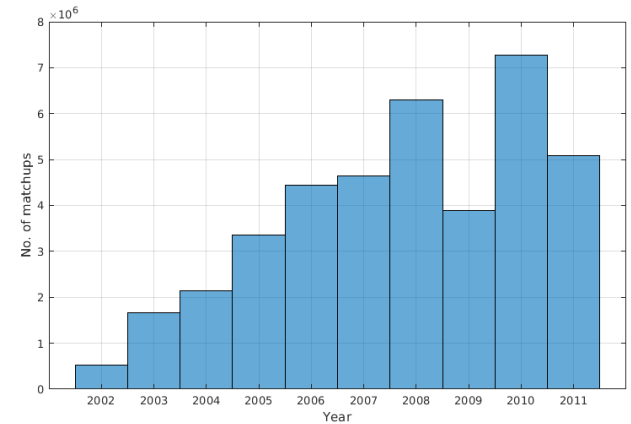
- Resampled to resolution; 10 km, all channels
- Orbit files, ascending and descending

- Every matchup includes:

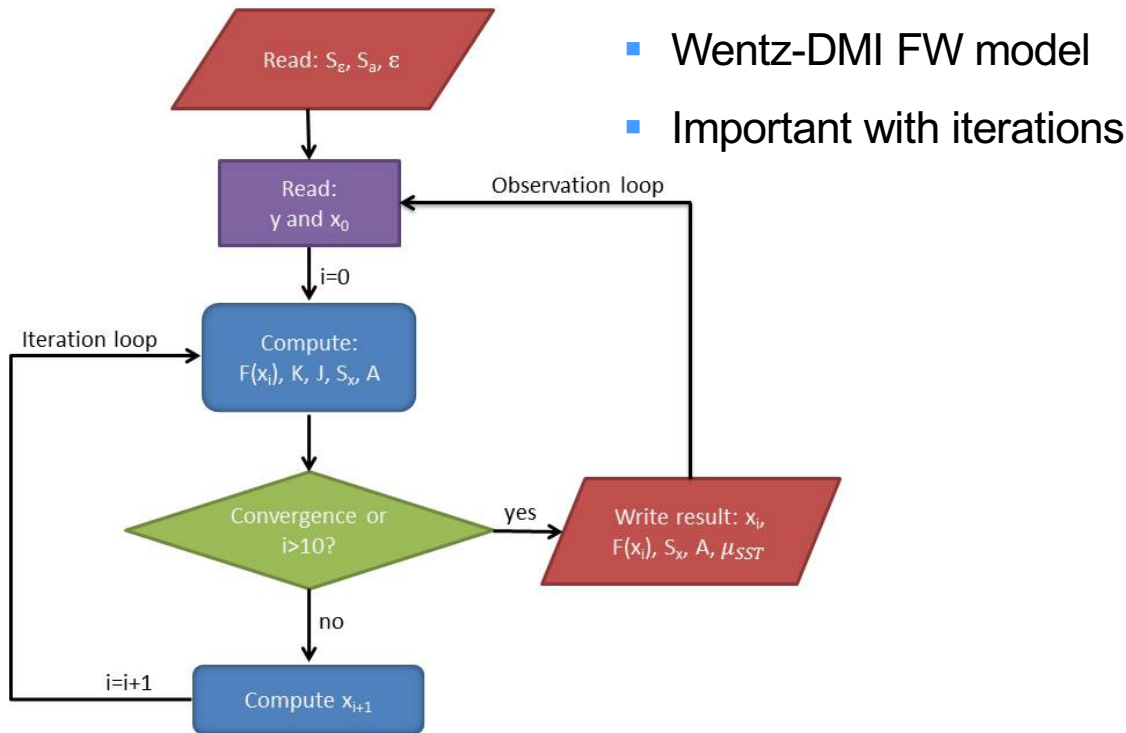
- 21x21 extract of AMSR-E TBs + aux info
- 5x5 extract of NWP variables
- 60 vertical layers for NWP
- In situ SST history
- 5x5 sea ice

- Netcdf format

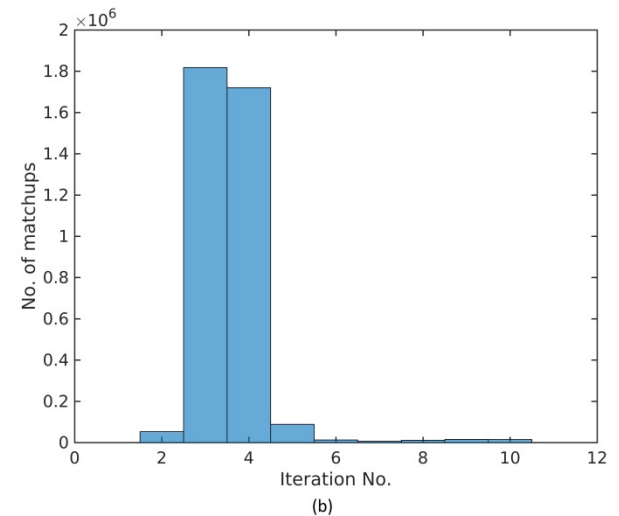
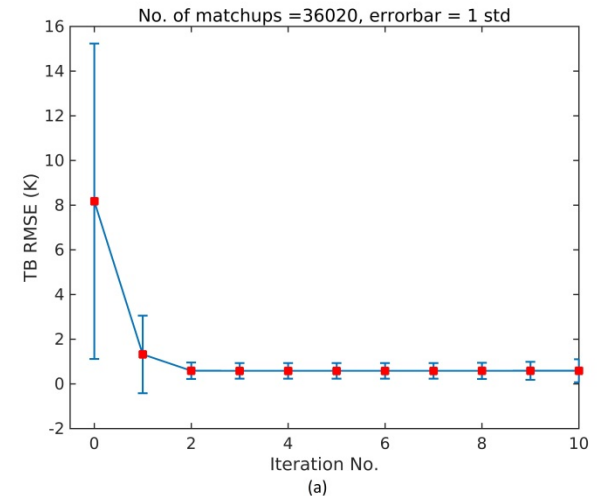
2002-2011



Optimal Estimation (OE) setup

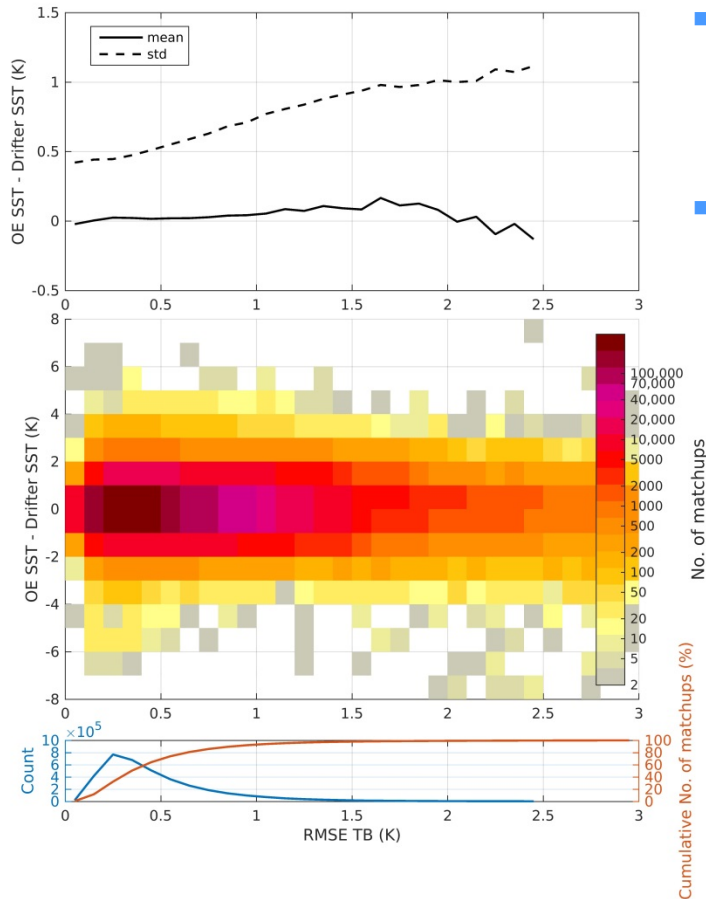


y: TBs (6V/H, 10V/H, 18V/H, 23V/H, 36V/H)
x : State vector (SST, TCWV, TCLW, WS)
S_e : Measurement and FW model error covariance
S_a : á priori error of state variables
x₀ : First Guess values

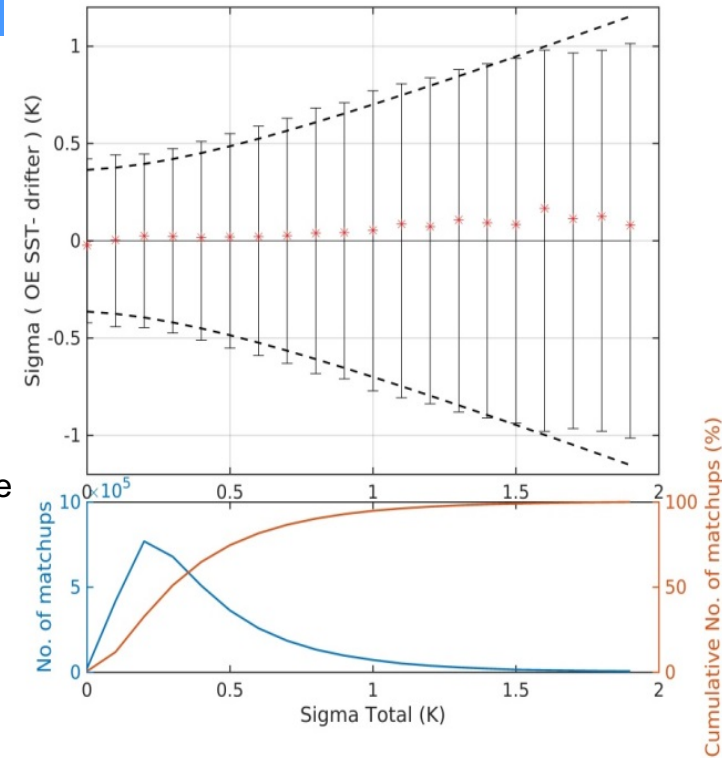


Uncertainty in SST retrieval

OE SST uncertainty validation with respect to drifter SST.



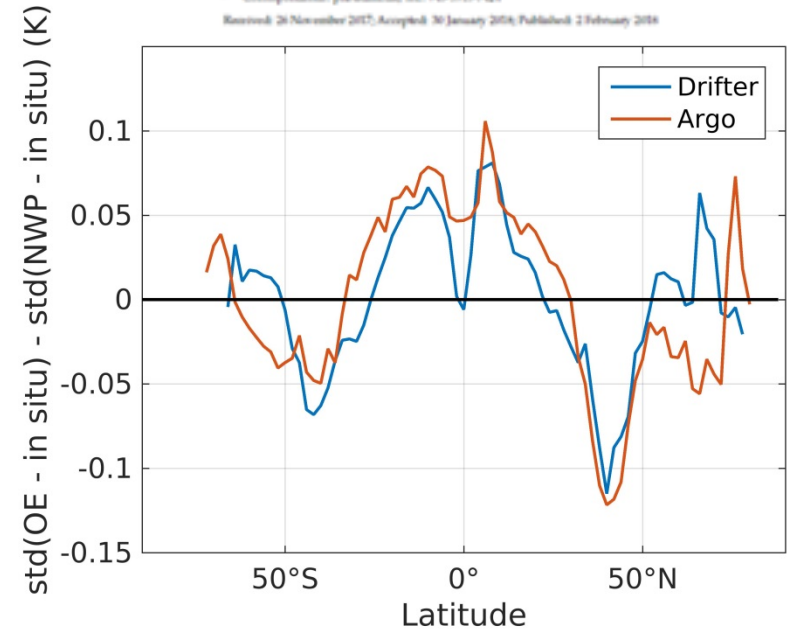
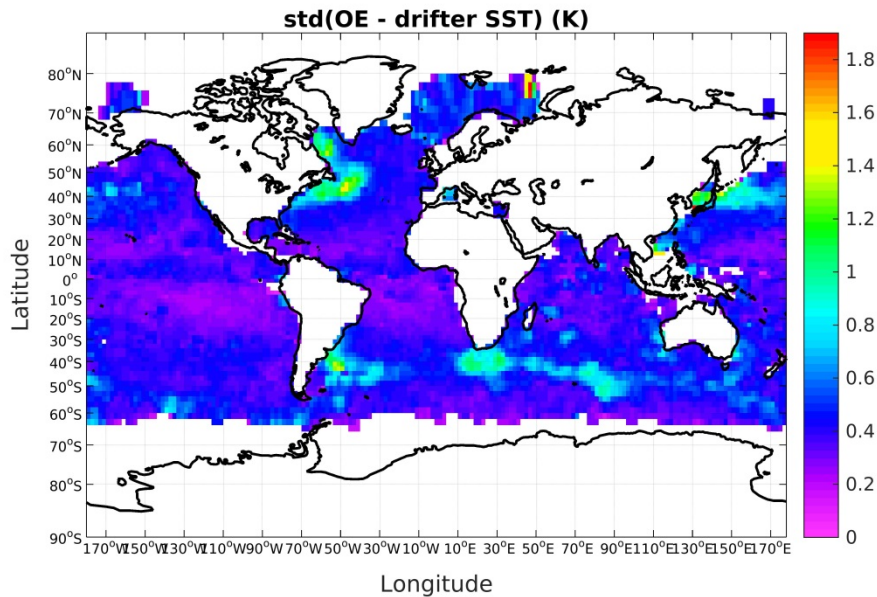
- RMSE TB as quality indicator
- Can be used for:
 - Filtering
 - Uncertainty estimate



Filter	Bias/K OE-Drifter	std/K OE-Drifter	N (10^6)	
Convergence test passed	0.02	0.57	3.7429	=100%
RMSE _{TB} < 1 K	0.02	0.51	3.4329	=92%
RMSE _{TB} < 0.50 K	0.02	0.47	2.3953	=64%
RMSE _{TB} < 0.35 K	0.02	0.45	1.5681	=42%

Global validation

- High standard deviations in e.g.,
 - The Gulf Stream Extension
 - The Kuroshio Current
 - The Aghulas Retroflexion areas
- OE SST better than NWP SST in mid-latitudes, while NWP SST is better in the tropics.



OE work is now published in:

remote sensing MDPI

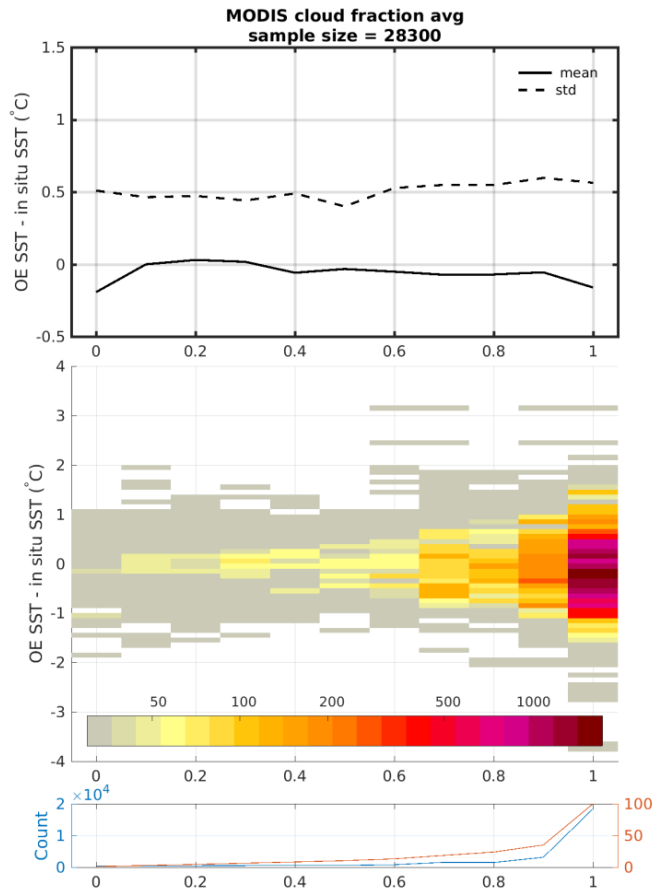
Article
Optimal Estimation of Sea Surface Temperature from AMSR-E

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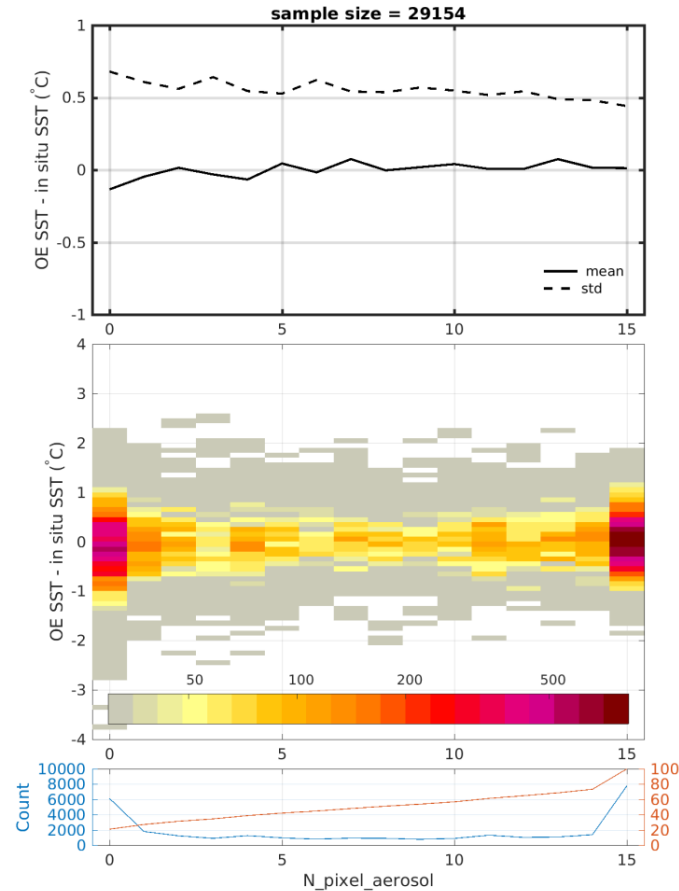
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Received: 26 November 2017; Accepted: 30 January 2018; Published: 2 February 2018

Impact from clouds and aerosols (1)

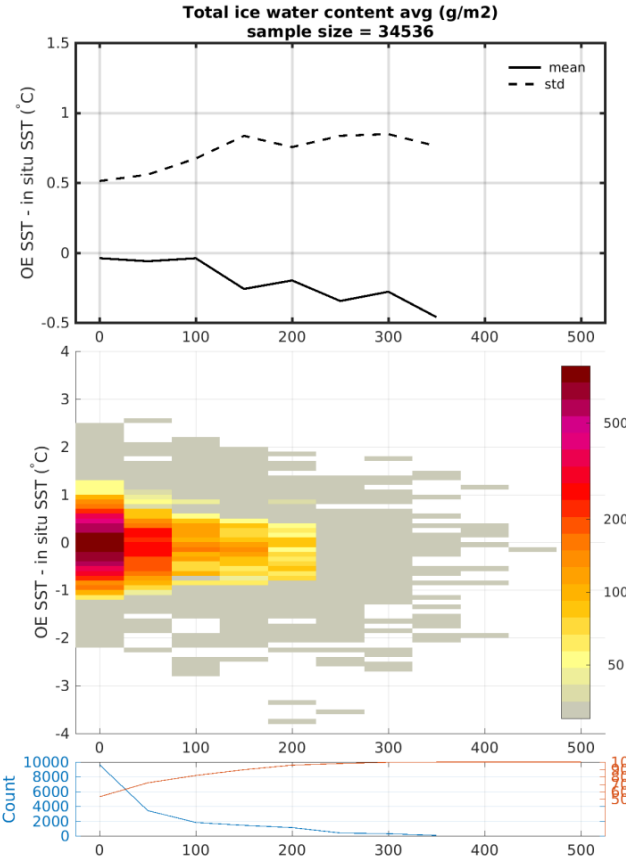


Modis cloud fraction

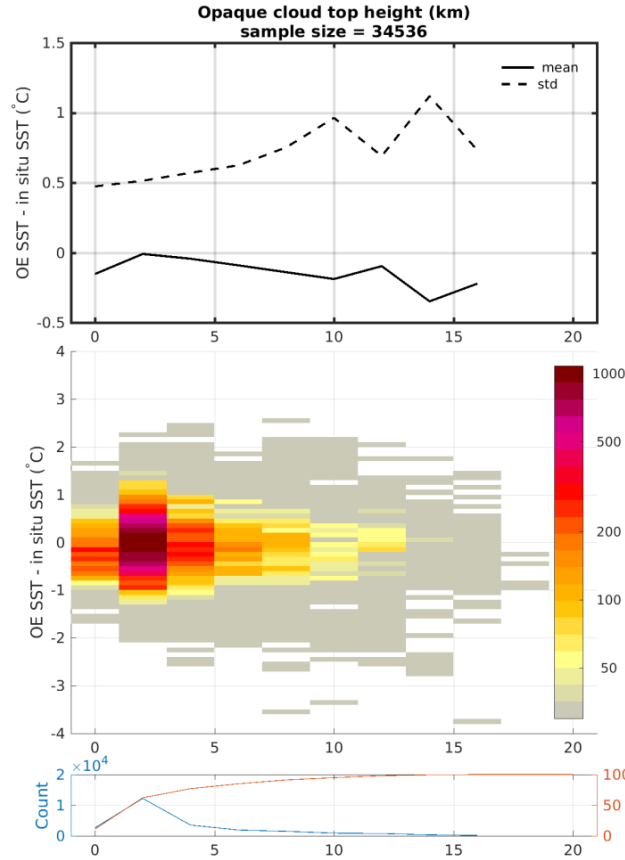


Number of pixels containing aerosols (1-15)

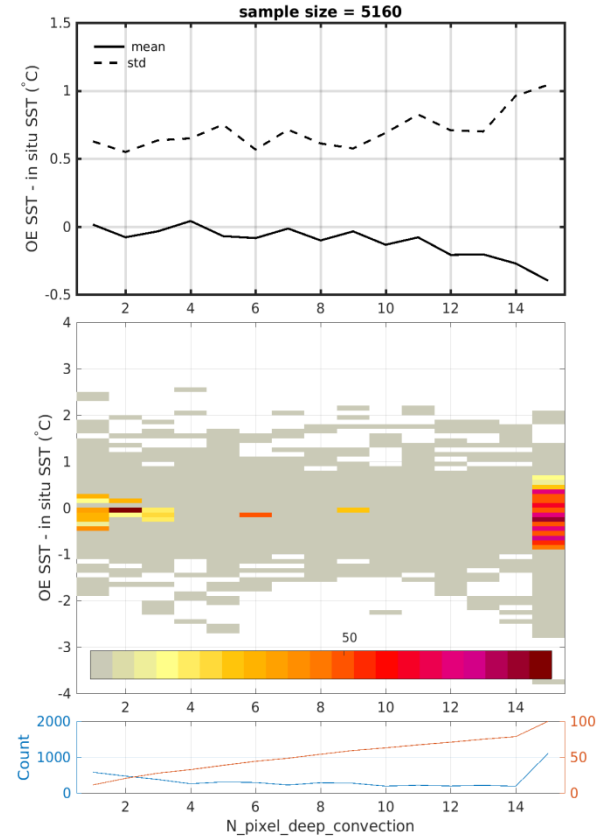
Impact from clouds and aerosols (2)



Total ice water content (TIWC; g/m²)

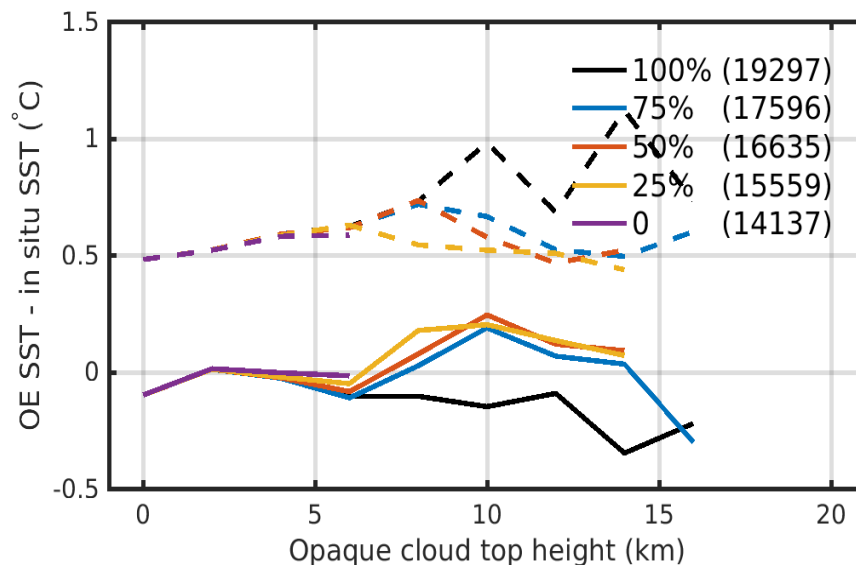
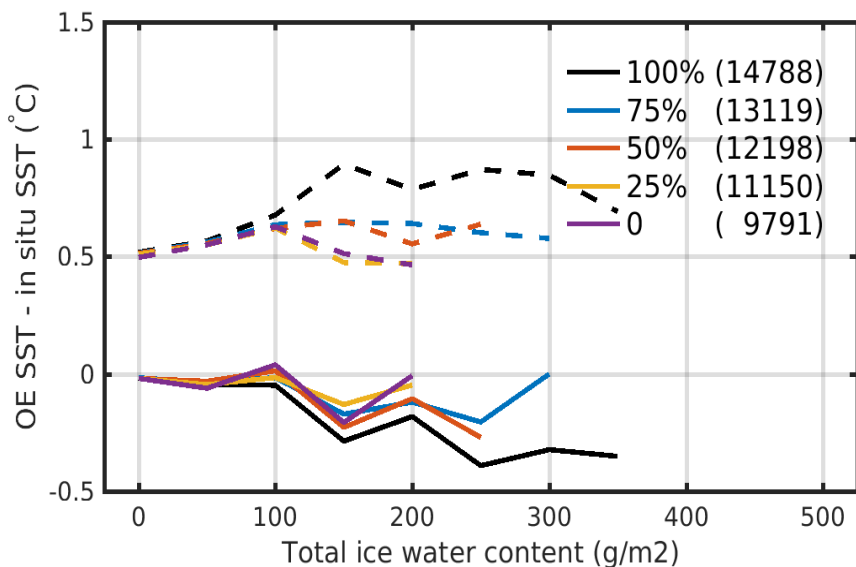


Opaque cloud top height (CTH; km)



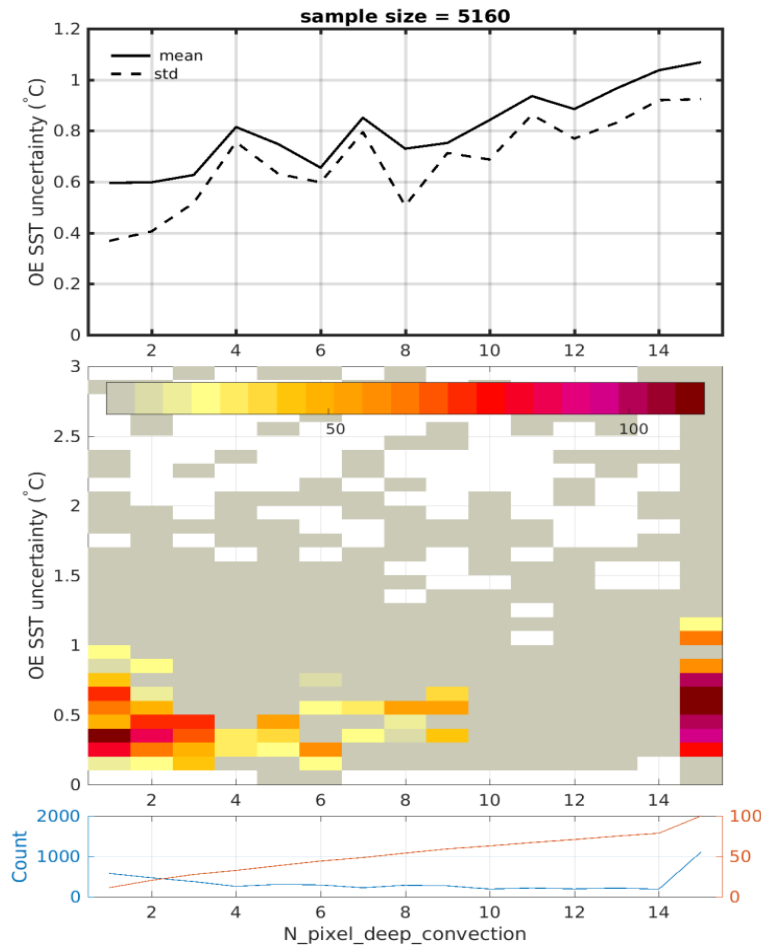
Number of pixels containing deep convective clouds (1-15)

Performance and filtering effects

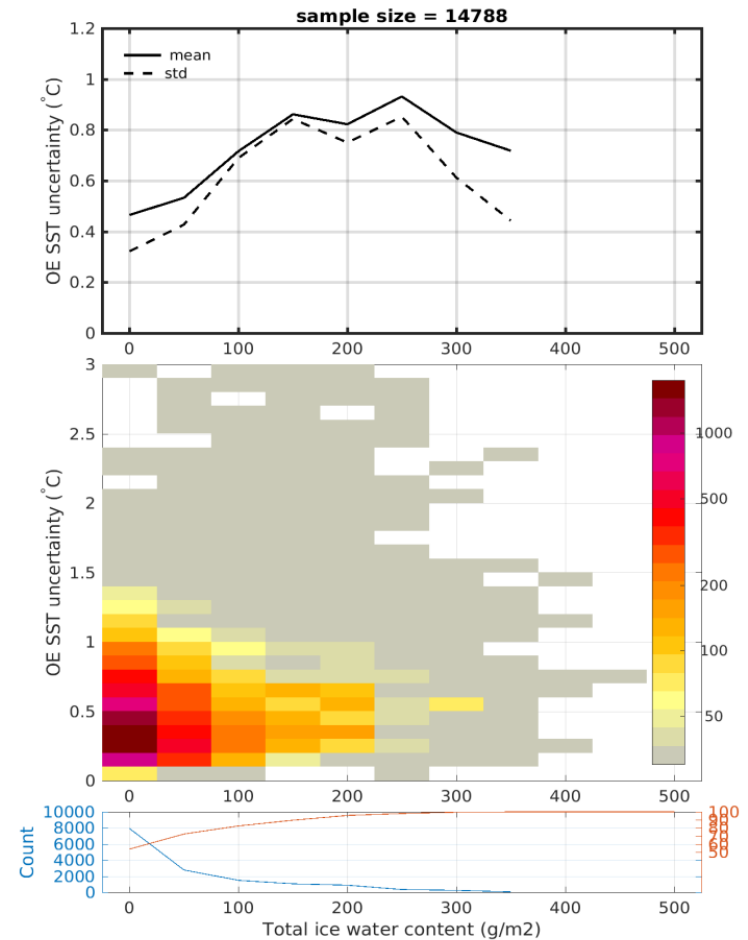


SST (OE-In situ)	Calipso (100 %)	Calipso (50 %)	Calipso (0 %)
Mean	-0.02	-0.00	-0.00
Std	0.56	0.51	0.50
Num	29,154	26,492	23,994

SST uncertainty vs. cloud parameters



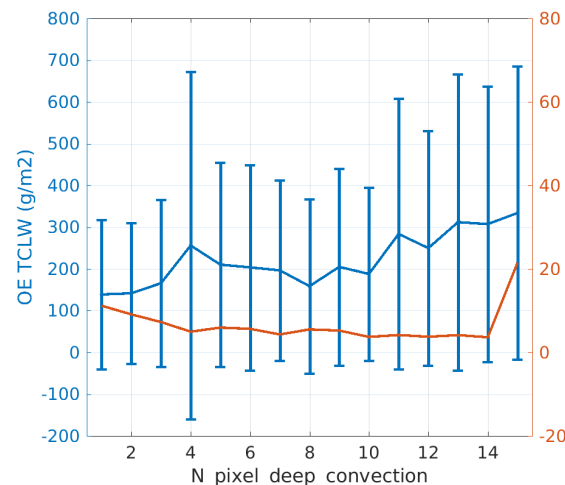
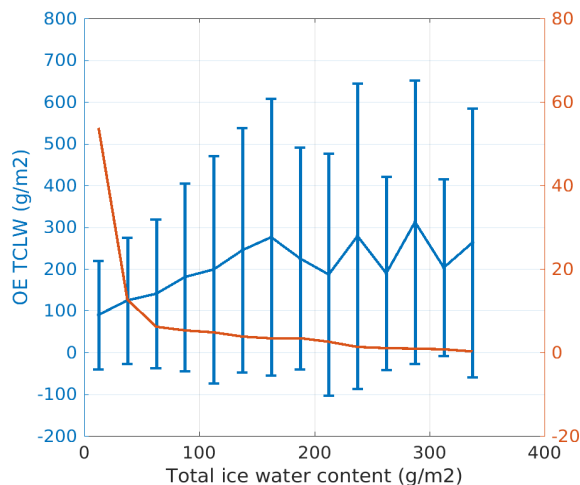
Number of pixels containing deep convective clouds



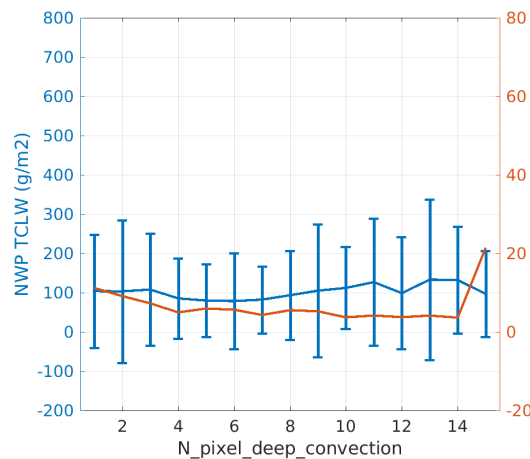
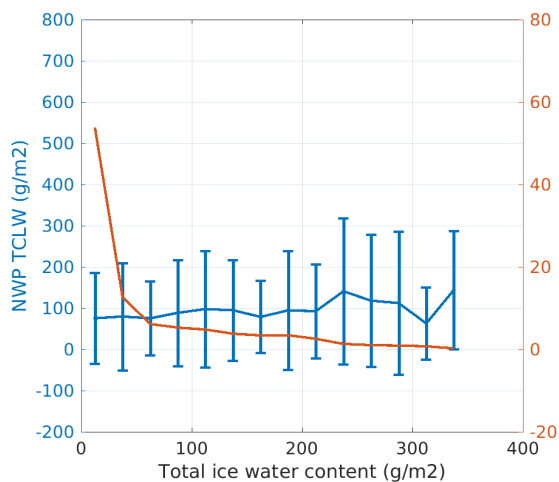
Total ice water content (TIWC; g/m²)

Total cloud liquid water content

OE TCLW



NWP TCLW



Conclusion

- PMW SST OE retrievals developed:

Updating state vector important

Performance and uncertainty estimates very good

- Atmospheric impact on SST retrieval:

Generally very stable performance

Impact from deep convective clouds

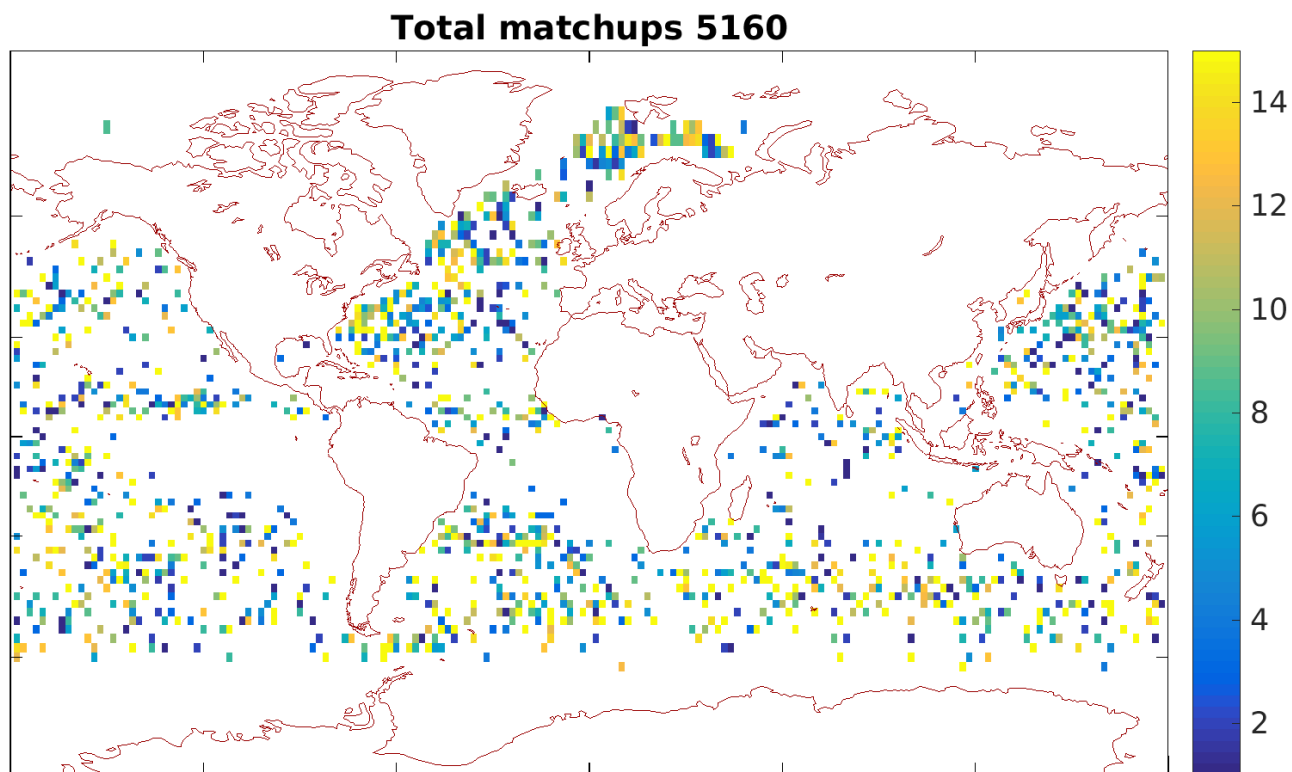
OE can Identify and remove these effect

Way forward

- Improve the Wentz-DMI forward model
- Further assess atmospheric influence on retrieval
- Inter-compare RTTOV and Wentz-DMI forward models
- Implement OE for AMSR-2

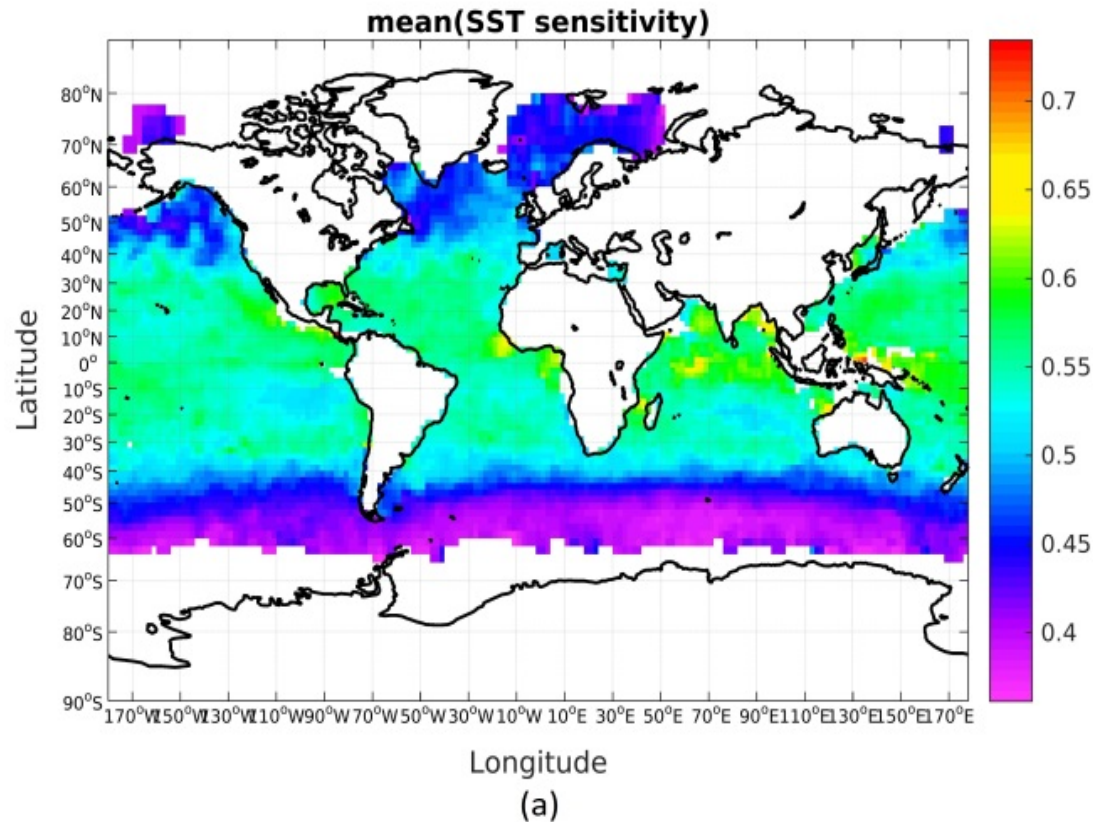
Thank you!

Distribution of deep convective clouds



Distribution of the number of pixels, ranging from 1 to 15, containing deep convective clouds averaged for 2x2 degree bins

Sensitivity



The SST sensitivity is lowest in high latitudes and increases towards the equatorial region, which is consistent with the fact that $\partial TB/\partial SST$ is smaller for cold waters (especially for X-band 10.65 GHz channels)