

# Hyperspectral Observations of Land Surfaces: Temperature & Emissivity

Isabel F. Trigo

Contributions from: Frank Göttsche, Filipe Aires, Maxime Paul

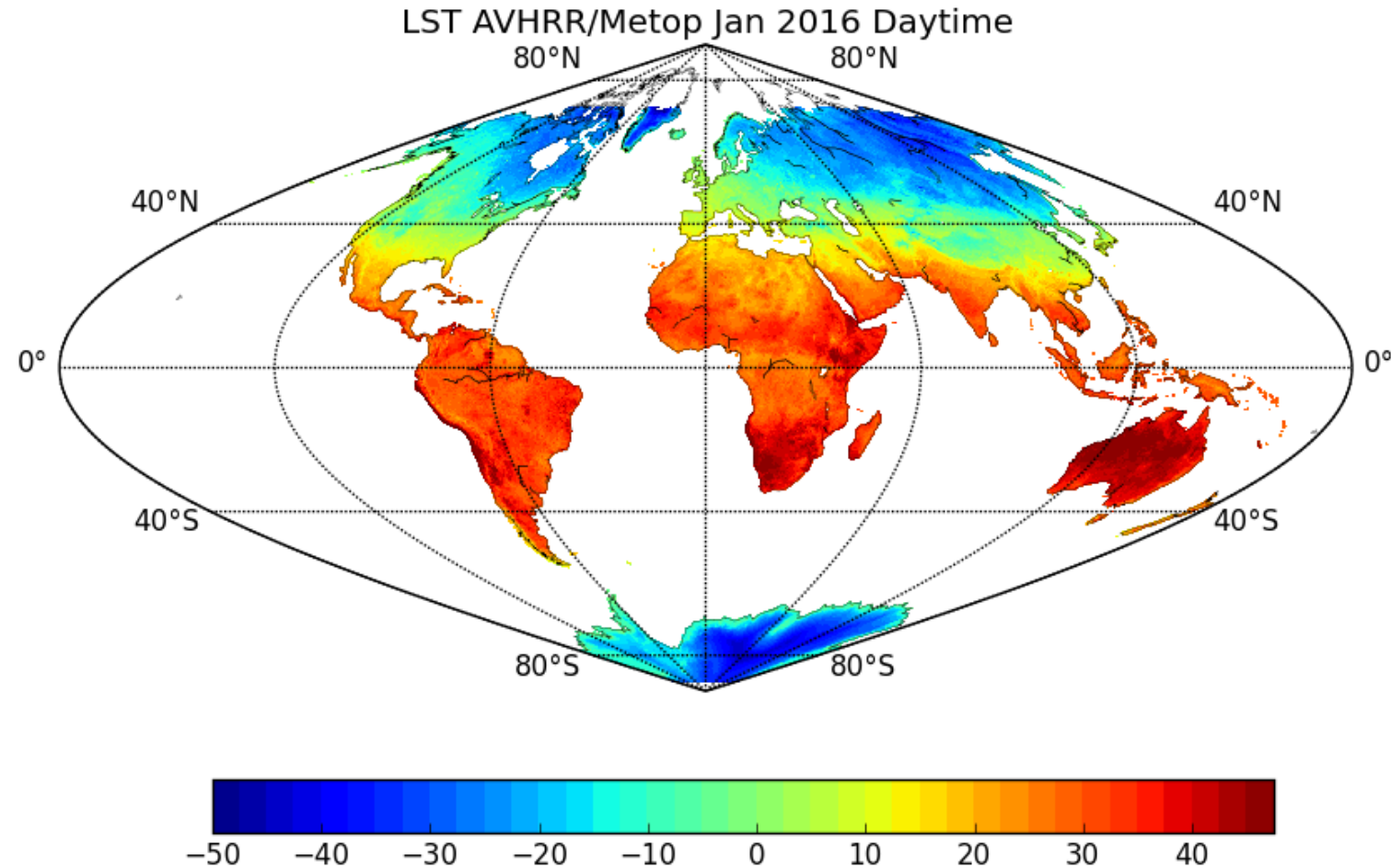
## Outline

### Land Surface Temperature

- Products & Requirements
- Validation
- Sources of Uncertainty - Emissivity
- Use of Hyperspectral observations to address the above
  - Retrieval of IASI emissivity spectrum and LST
- Concluding Remarks

## Land Surface Temperature

- Aggregated radiometric surface temperature of the ensemble of components within the sensor FOV
- LST is important for
  - ✓ evaluating land surface & land-atmosphere interaction
  - ✓ constraining surface energy budgets (& model parameters)
  - ✓ providing observations of surface temperature change both globally and in key regions



## Land Surface Temperature – remote sensing products

- Most estimated from TOA brightness temperature within Thermal Infrared
  - ✓ Clear-Sky only
  - ✓ Given the high variability of LST, user requirements value:
    - spatial resolution – from high (~50 m) to low (~5 km) resolutions
    - Temporal frequency – from 15 min (10 min) to 16 days

## EUMETSAT Satellite Applications Facility on Land Surface Analysis (LSA-SAF)

- AVHRR/Metop: global, daytime & night-time fields, 1 km x 1 km
- SEVIRI/Meteosat: 15-min, 3 km (nadir)

## SEVIRI LST

Standard Split-window algorithm

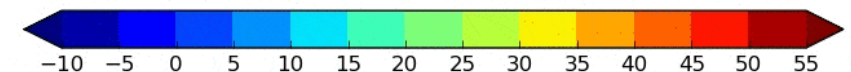
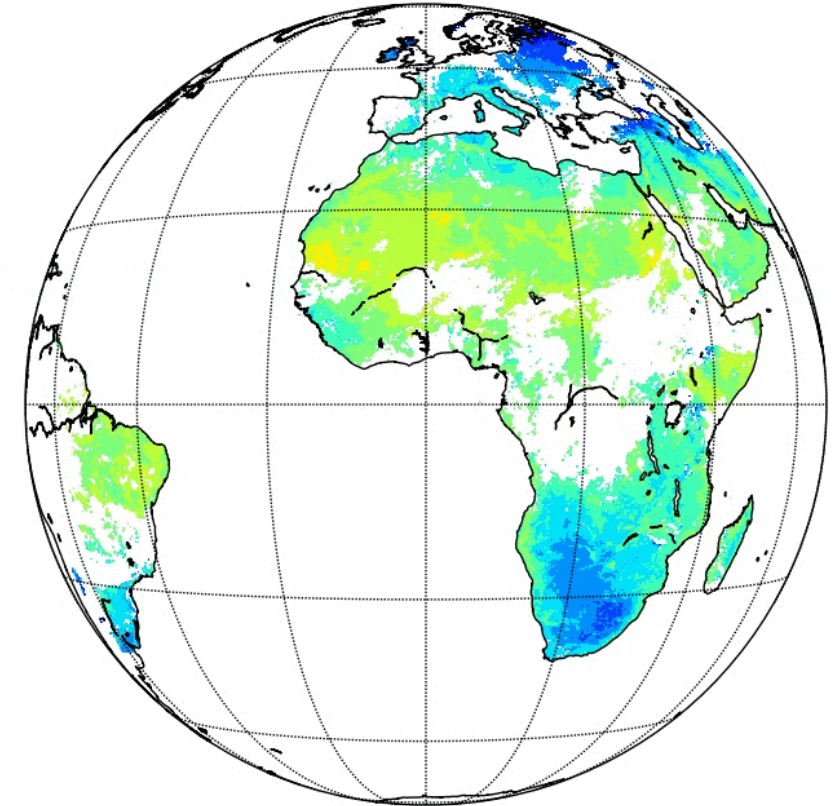
$$LST = f ( Tb_{10.8}, Tb_{12.0}, \epsilon_{10.8}, \epsilon_{12.0}, \dots )$$

- Semi-empirical: simplification of Rad Transf Eq
- Atmospheric correction:  $[Tb_{10.8} - Tb_{12.0}]$ , View angle, TCWV forecasts
- $\epsilon_{10.8}$ ,  $\epsilon_{12.0}$  assigned depending on land cover & Fraction of Vegetation Cover (FVC)

✓ Similar approach followed for AVHRR

✓ Efficient, accurate, stable

LST SEVIRI/LandSAF 17052017 00





# Land Surface Temperature - Validation

## KIT Validation Sites



Portugal, Evora

Senegal, Dahra

Namibia, Gobabeb

Namibia, Farms

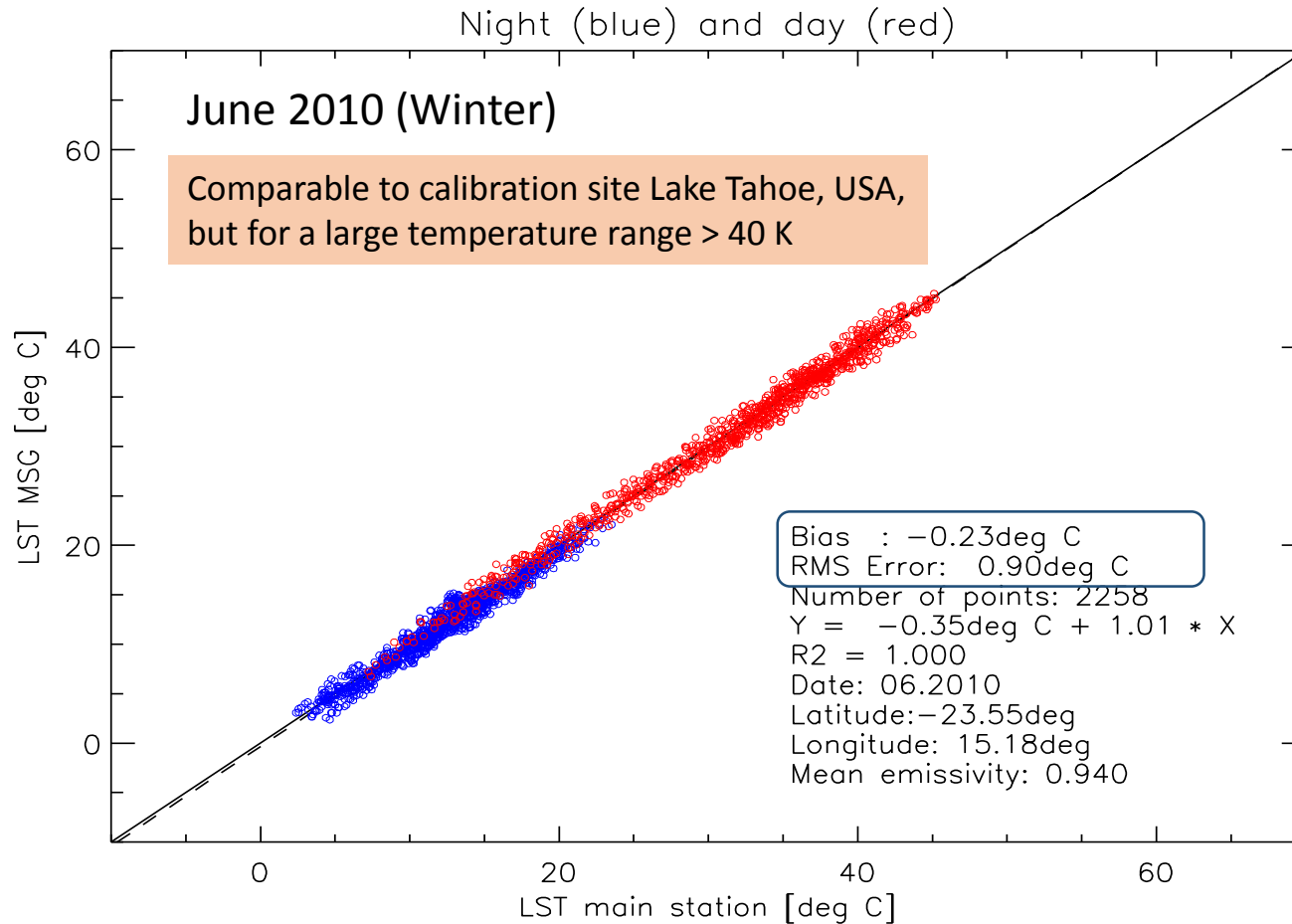
Temperate vegetation

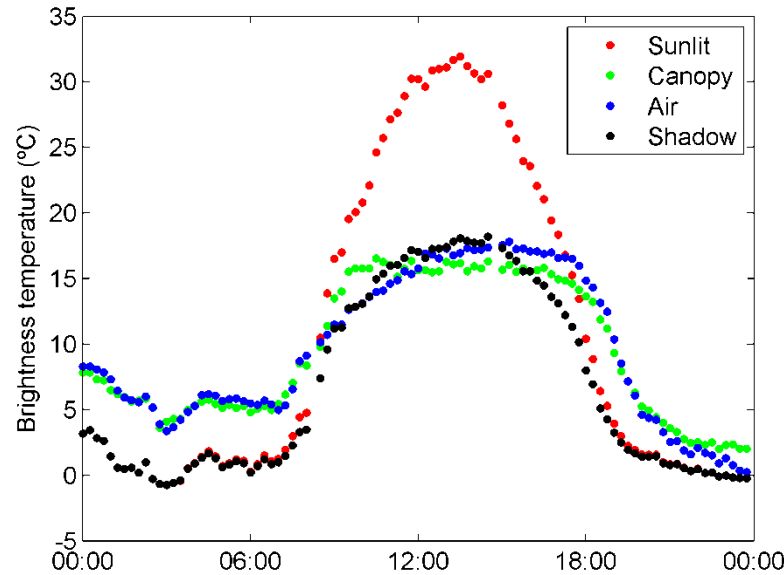
Semi-arid (tiger bush)

Desert

Kalahari bush

- Large, homogeneous sites
- Well characterised
- Different climates & biomes
- **Dedicated** to LST validation





## Radiometric temperature in a summer day

- High surface heterogeneity
- Upscaling needs to take into account distribution of surface elements and ...
- ... viewing & illumination geometries





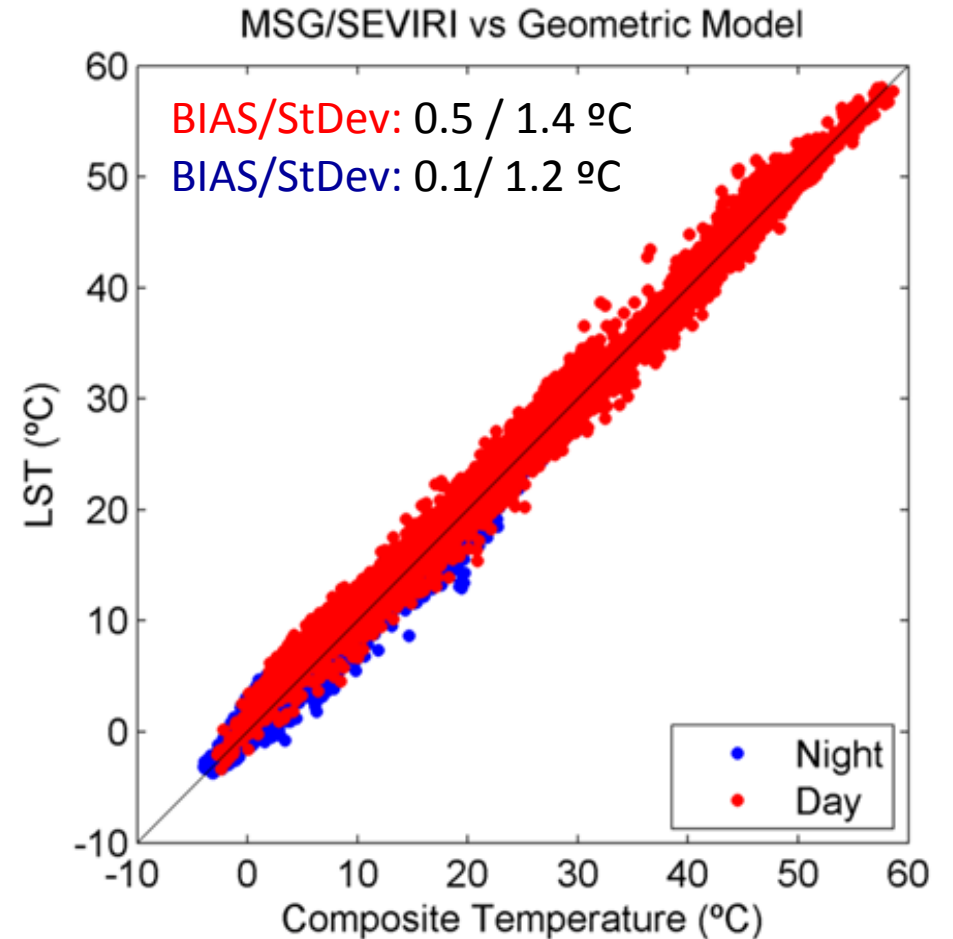
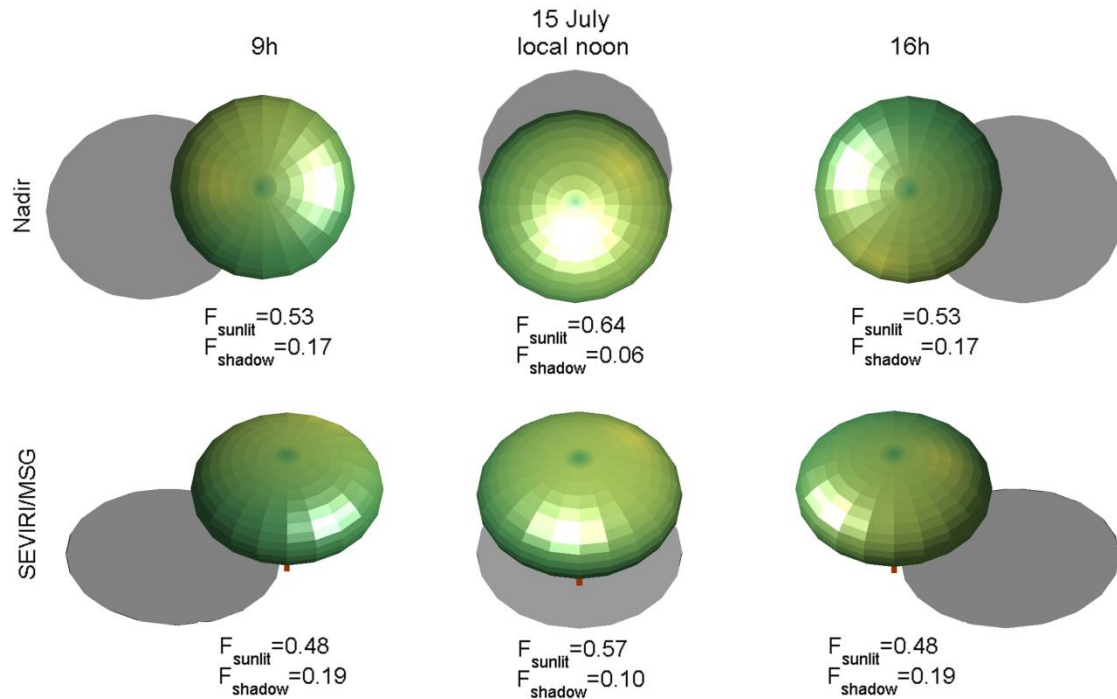
# Evora LST versus SEVIRI/MSG LST

## Geometric model:

shapes of objects seen  
by the sensor

+

**Boolean model:** overlap  
probabilities, i.e., actual  
fraction of end-members

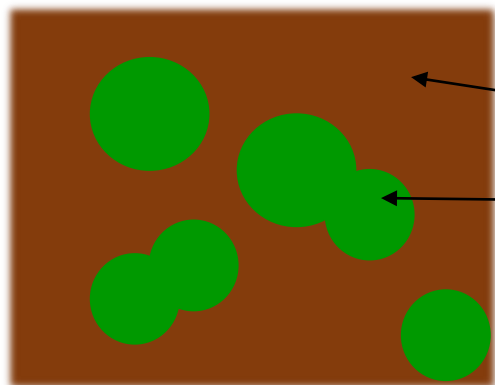


Ermida, S. L., I. F. Trigo, C. C. DaCamara, F. M. Göttsche, F. S. Olesen, G. Hulley, 2014: Validation of remotely sensed surface temperature over an oakwood landscape – The problem of viewing and illumination geometries. Remote Sens. Env., DOI:10.1016/j.rse.2014.03.016

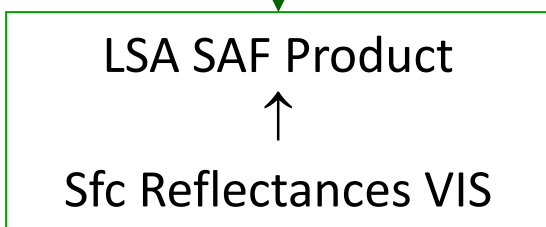
## Emissivity Estimation:

- ✓ Assumes pixel dominant landcover is known
- ✓ Pixel emissivity can be estimated

Pixel MSG



$$\epsilon = \epsilon_{veg} \text{FVC} + \epsilon_{ground} (1 - \text{FVC}) + \delta\epsilon$$



- Non-accounted effects (multiple reflections at sfc)
- Variability of bare ground/ vega within pixel

## Channel Emissivity per VEGETATION / SOIL classes

$$\mathcal{E}_{C-VEGA/SOIL} = \frac{\int_{\lambda_1}^{\lambda_2} f_{\lambda} \epsilon_{\lambda} B_{\lambda} d\lambda}{\int_{\lambda_1}^{\lambda_2} f_{\lambda} B_{\lambda} d\lambda}$$

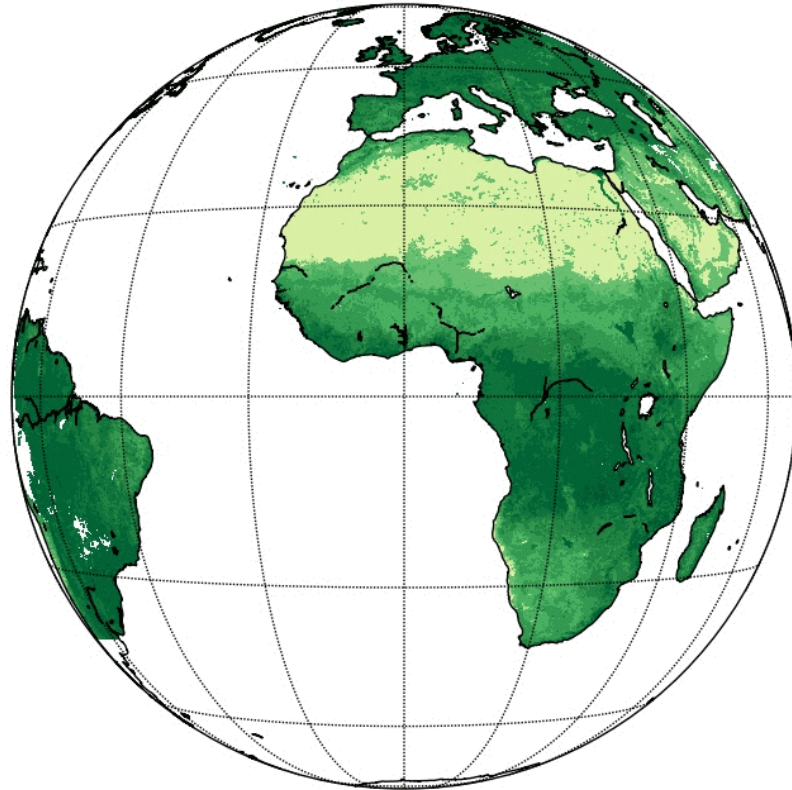
Emissivity at  $\lambda$   
 - Vegetation types  
 - Soil types      ← (Spectral Libraries)

Channel response function

Trigo et al. (2008) in *IEEE Trans Geosc Remote Sens.*, Doi: 10.1109/TGRS.2007.905197

## Surface Emissivity IR10.8: 2016

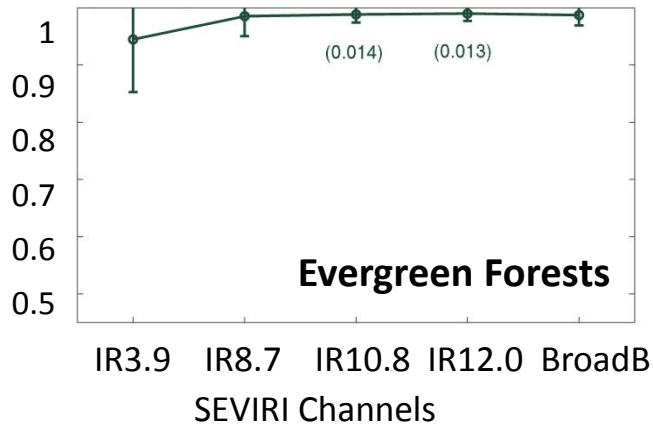
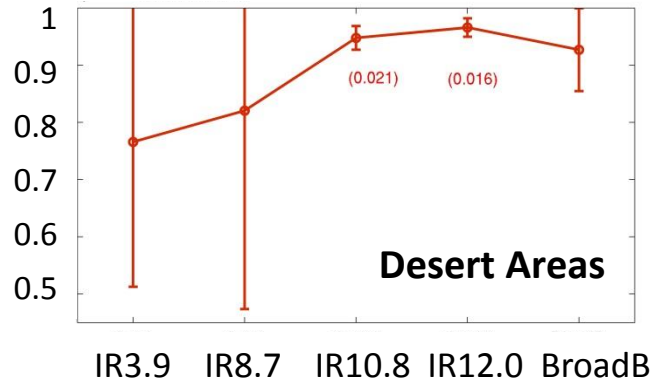
EMISS 10.8  $\mu\text{m}$  SEVIRI/LandSAF 15012016



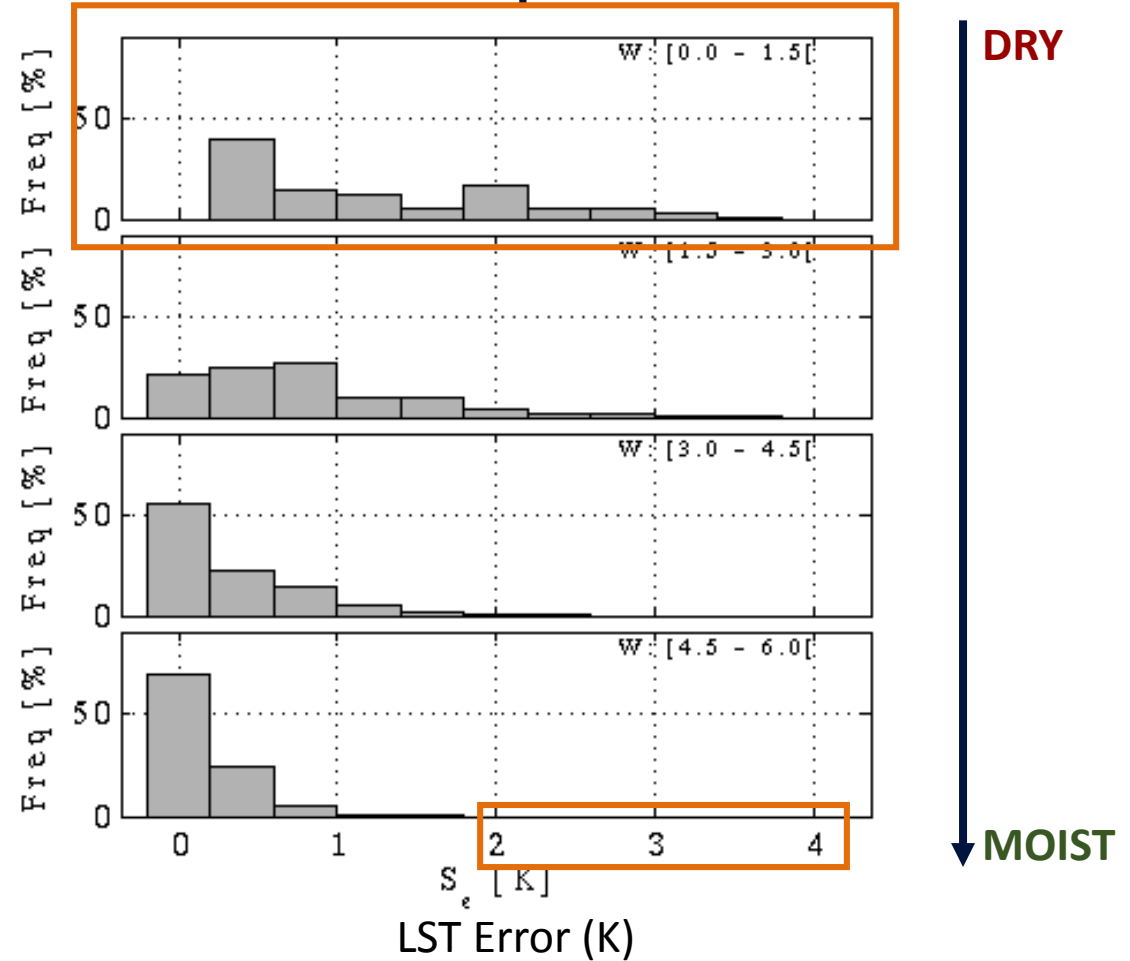
### Emssivity: Vegetation cover & Land Cover

- ✓ Captures well vegetation dynamics
- ✗ Highly dependent on errors in Land cover classification
- ✗ Fails in representing spatial variability over desert regions

## Emissivity uncertainty



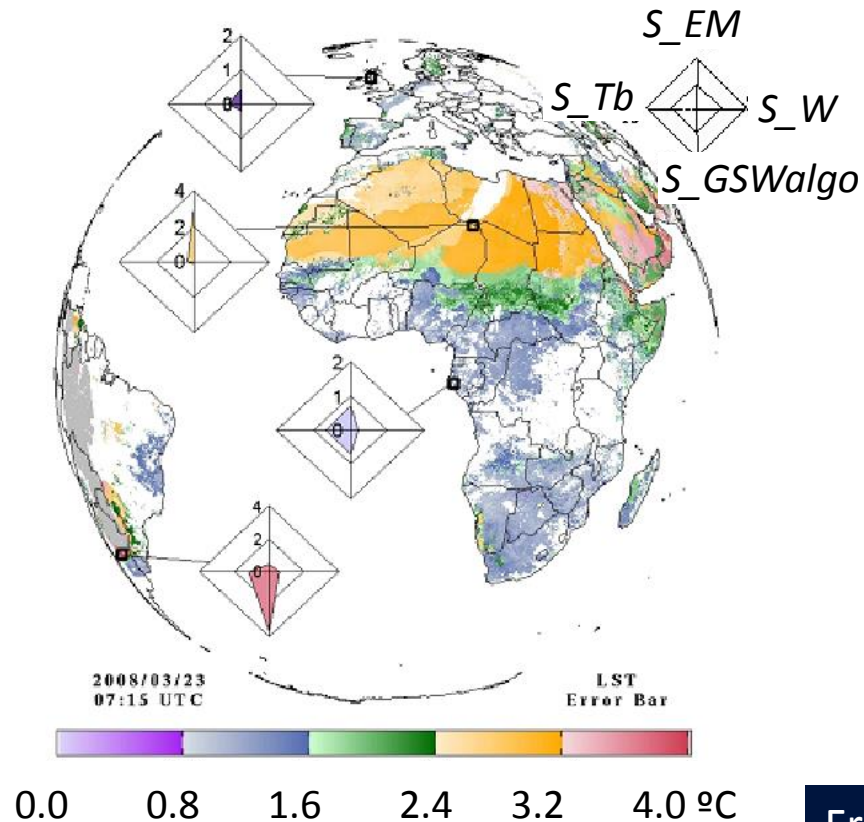
## EMISSION uncertainty in channels 10.8 & 12.0: Impact on LST



Freitas et al (2010) in TGRS



## LST uncertainty (provided with NRT LST product)



Uncertainty estimated taking into account:

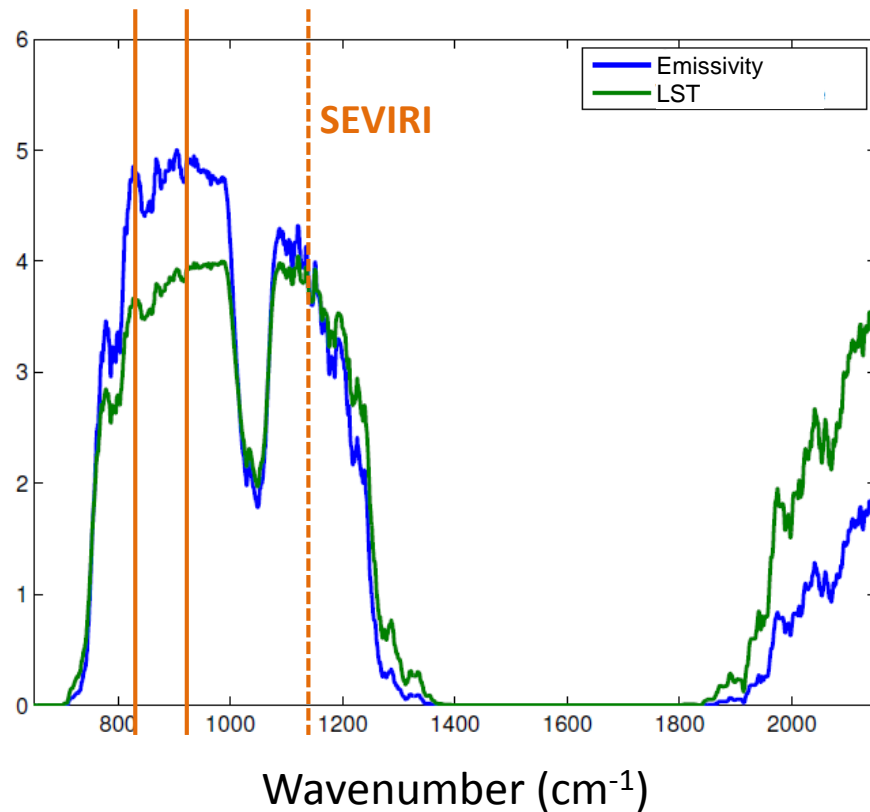
- Uncertainty of the GSW algorithm
- Propagation of input uncertainties:
  - Emissivity
  - Sensor noise
  - TCWV ECMWF forecasts

**Land Surface Emissivity** is the main source of LST errors over deserts & sparsely vegetated areas under dry atmospheric conditions

Freitas, S. C., Trigo, I. F., Biucas-Dias, J. M., Goettsche, F.-M., 2010: Quantifying the Uncertainty of Land Surface Temperature Retrievals From SEVIRI/Meteosat, *IEEE Trans. Geosci. Remote Sens.* DOI: 10.1109/TGRS.2009.2027697

## Sensitivity of IASI Spectra [in K] to:

- 5 K in LST
- 0.1 in surface Emissivity



- ✓ High sensitivity to both LST & Emissivity
- ✓ Simultaneous retrieval may contribute to significantly increase accuracy and ...
- ✓ ... improve a priori knowledge of surface emissivity for sensors with lower spectral resolution

## Physical Retrieval of LST & Emissivity

### Methodology developed by Paul et al. (2012)

#### ➤ Emissivity 1st guess:

- MODIS 6 bands + land-cover classification + spectral libraries ⇒ **Emissivity spectra Database**
- PCA used for compression: emissivity spectra represented by limited number of spectral features

#### ➤ Physical retrieval:

- Retrieve  $P$  emissivity Principal Components & LST
- The full emissivity spectra can be estimated from the above

Paul, M., F. Aires, C. Prigent, I. F. Trigo, and F. Bernardo, 2012: An innovative physical scheme to retrieve simultaneously surface temperature and emissivities using high spectral infrared observations from IASI, *J. Geophys. Res.*, **117**, D11302, doi:10.1029/2011JD017296.

## Principal Component Analysis

Represent the full spectrum by:

$$(\varepsilon_1, \dots, \varepsilon_N) \approx PC \cdot EV + \bar{\varepsilon} \quad \text{with } N = 8461 \text{ (number of IASI channels)}$$

PC – vector with  $P$  principal components,  $P < N$

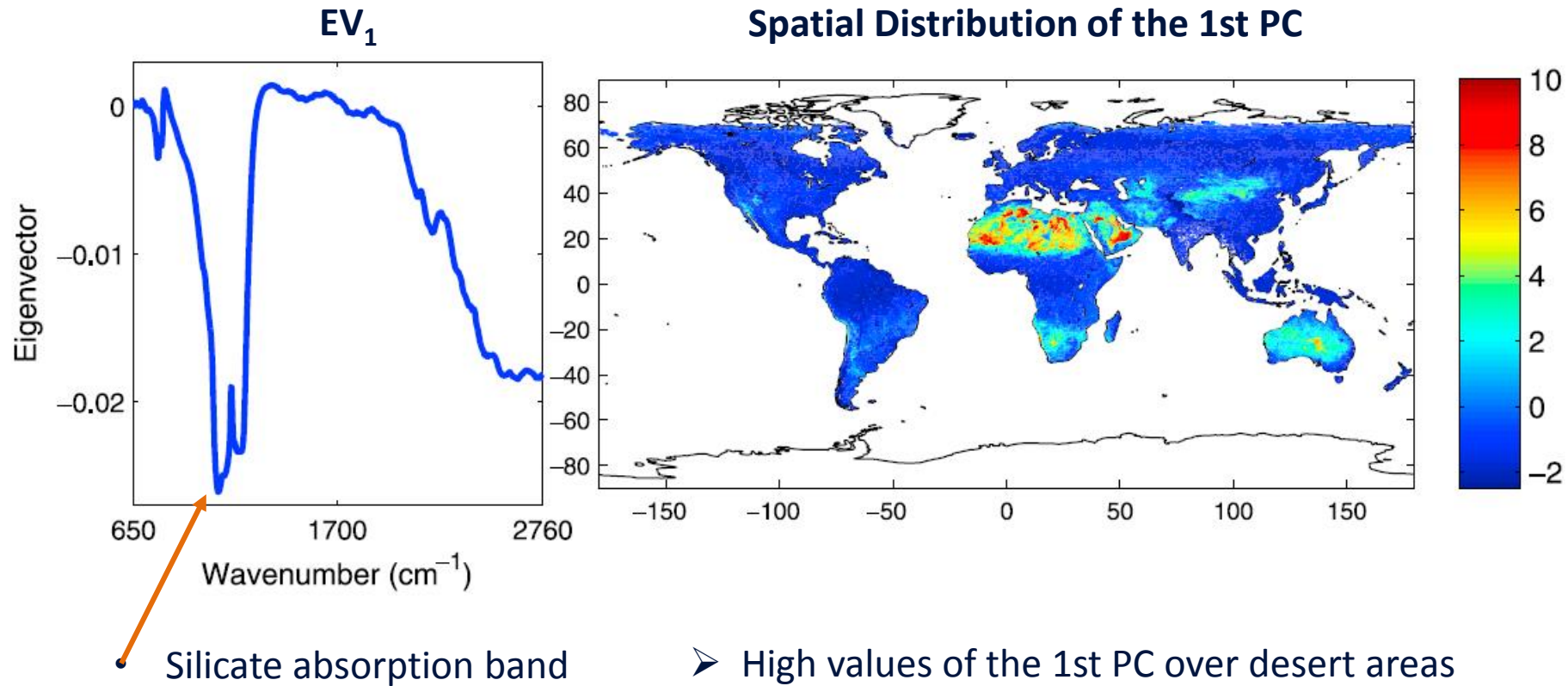
EV – eigenvector matrix considering only  $P$  components ( $P \times N$ )

$\bar{\varepsilon}$  mean emissivity spectrum

PCA  $\Rightarrow$  Global database spectral emissivity [land-cover & spectral libraries]

**$P = 10$**  explains 99.98% total emissivity variance.

NN interpolator trained with EM Database:  $P$  PCs from MODIS 6 band Emissivities



➤ High values of the 1st PC over desert areas

Paul et al. (2012)



## Physical retrieval

- Retrieve  $P$  emissivity Emissivity Principal Components & LST
- ... Using  $n$  IASI channels

Solving the equation [RTE +  $P$  PC for representation of emissivity spectra]:

$$(PC_1, \dots, PC_P, \Delta T) \cdot \underbrace{\begin{pmatrix} ev_{1,1} & \dots & ev_{1,n} \\ & \ddots & \\ ev_{P,1} & \dots & ev_{P,n} \\ F'_1(T_{fg}) & \dots & F'_N(T_{fg}) \end{pmatrix}}_M = -\bar{\epsilon} + F(T_{fg})$$

$$(PC_1, \dots, PC_P, \Delta T) = -\bar{\epsilon} + F(T_{fg}) \Delta T \cdot M^+$$

$\Delta T = LST - T_{fg}$  ( First Guess for LST)

For wavelenght  $i$ ,  $F_i(T) = A_i / B_i(T)$ , where:  $A$  depends only on TOA observations & First Guesses  
 $B_i(T)$  is the Planck function

## Physical retrieval

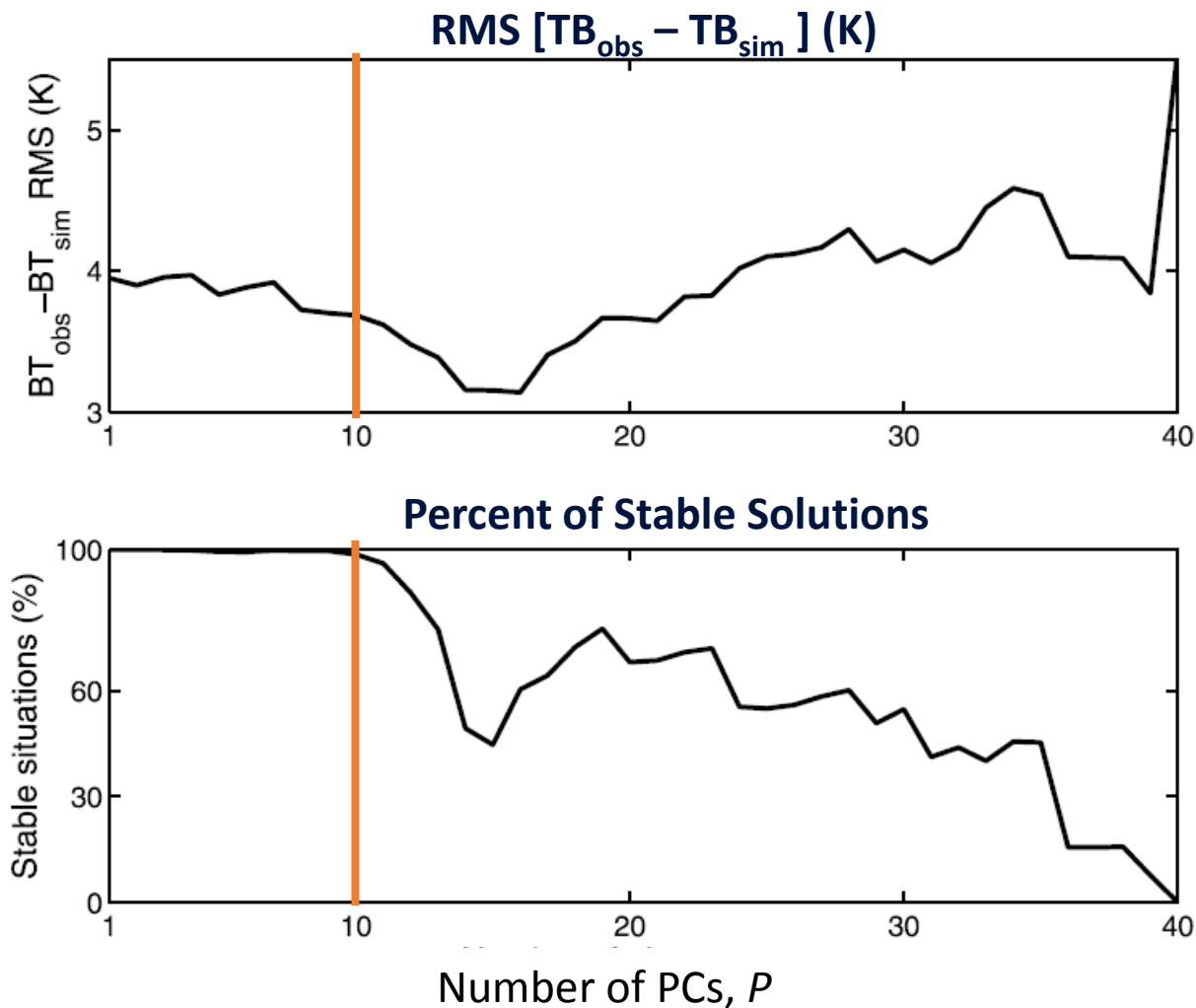
Assumptions:

- Atmospheric transmittance / emission is known!  
NWP Profiles (T, q, O3) + RTTOV
- Function  $F$  can be linearized around  $T_{fg}$

Choice of  $P$  Principal Components and  $n$  channels:

- $n$  restricted to window channels with lowest chance of being (too much) affected by the atmosphere  $\Rightarrow n = 512$  with highest transmittance,  $\tau$ , & lowest  $\tau$  gradient in spectra space;
- $P$  optimum value  $\Rightarrow$  balance between degrees of freedom & accuracy  $\text{RMS}[BT_{obs} - BT_{retrieved}]$   
 $P = 10$

Each retrieval considers **512 observations & 11 unknowns [10 PCs + LST]**

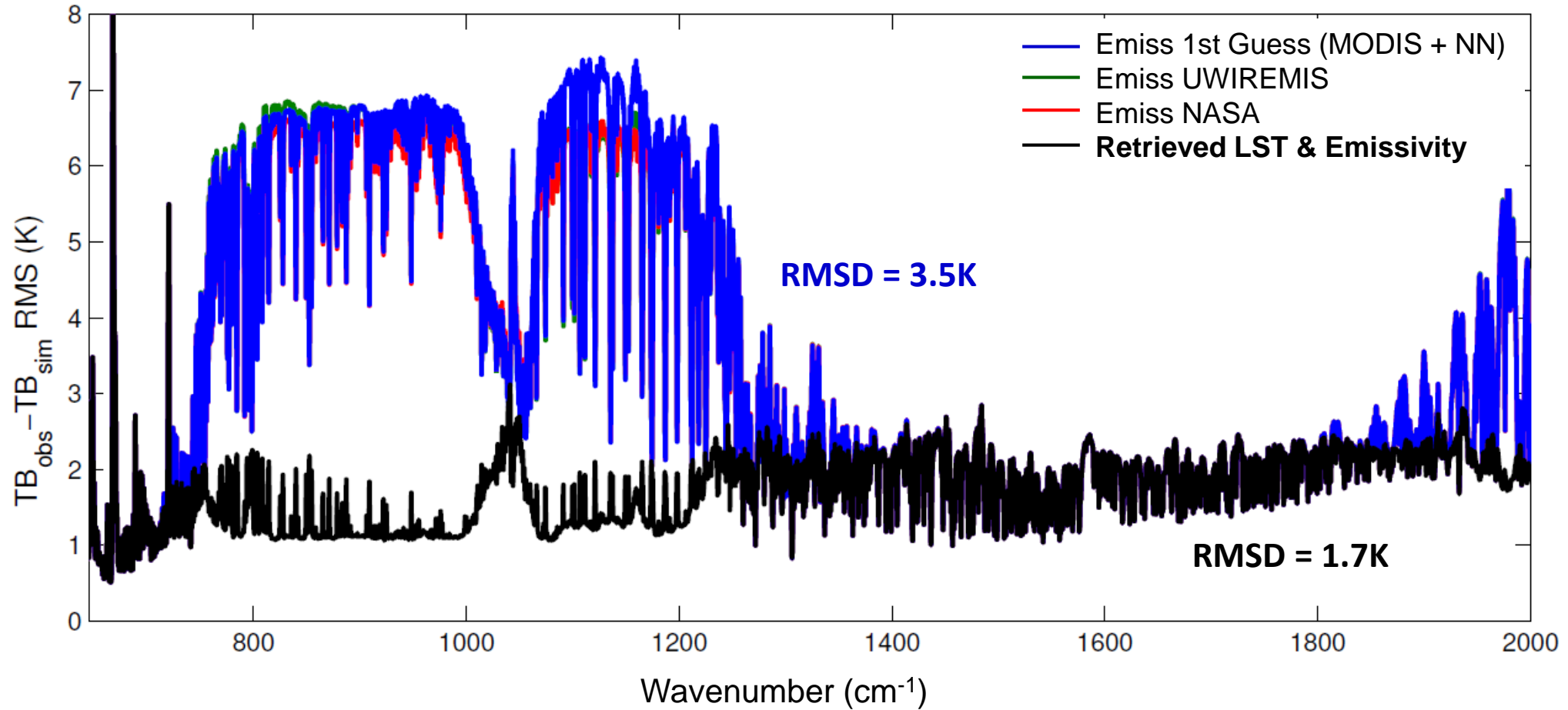


➤ Unstable solutions,  $|\Delta T| > 20$  K, are filtered out!

## Number of PCs $P = 10$

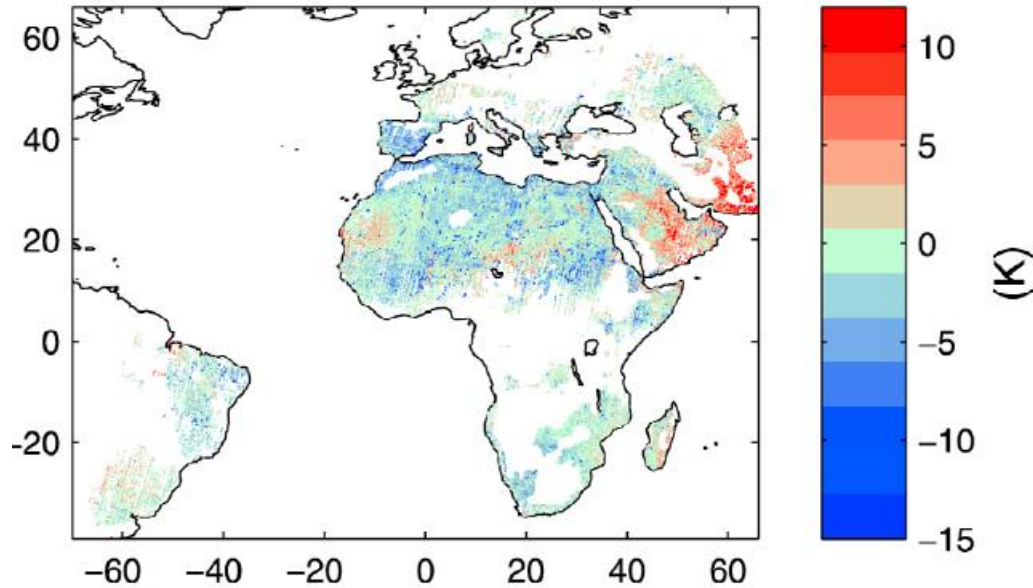
- Acceptable accuracy
  - Limits the % of unstable solution
- Too many PCs → too many degrees of freedom

Statistics over 4 weeks: Jan, Apr, Jul, Oct 2008



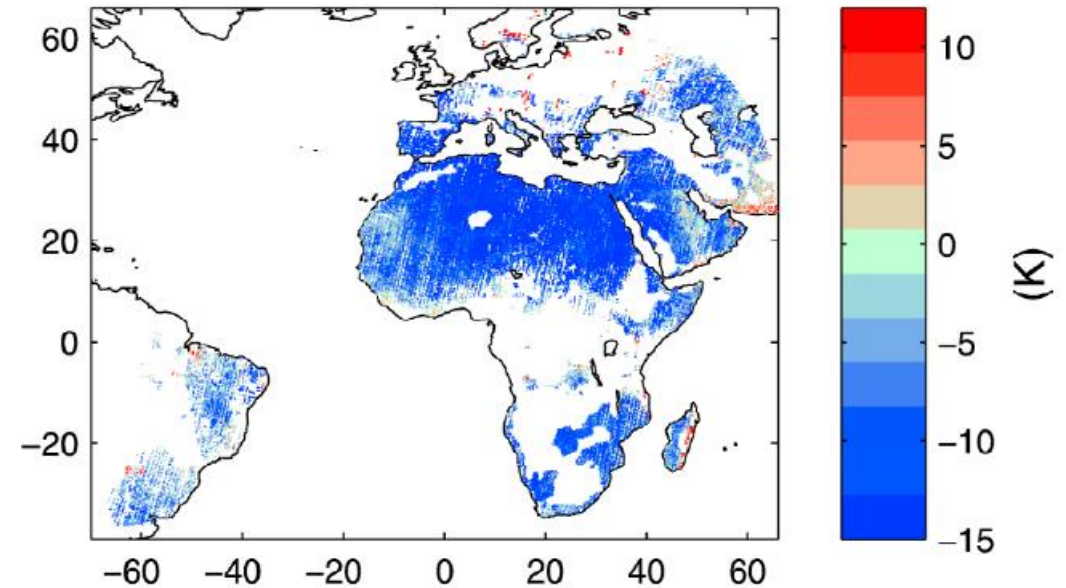
Statistics over 4 weeks: Jan, Apr, Jul, Oct 2008

IASI LST – SEVIRI LST



First Guess Ts

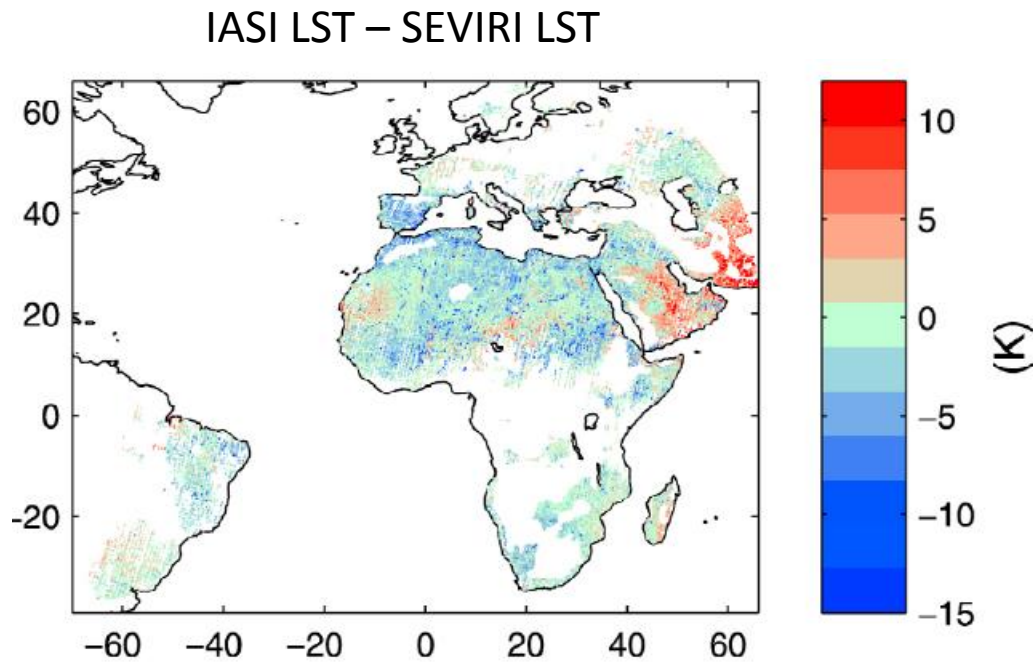
ECMWF Tskin – SEVIRI LST





# IASI LST & EM Retrieval versus SEVIRI LST

Statistics over 4 weeks: Jan, Apr, Jul, Oct 2008



Comparison against SEVIRI LST	Bias (K)	StDev (K)
ECMWF Tskin (ERA)	-6.0	6.3
IASI LST	2.3	3.5

Correlations		
ERA vs SEVIRI		0.78
ERA vs IASI		0.83
IASI vs SEVIRI		0.94

## Land Surface Temperature

- Regularly retrieved from (IR) imagers; split-windows proves to be efficient & stable
  - AVHRR: night-time and daytime LST; ~ 1km spatial resolution
  - SEVIRI: 15 min LST; 3km nadir
  - ...
- Validation with ground measurements
  - Gobabeb (Namibia) gravel plain: Bias < 0.25K & RMSE < 1.0K
  - Evora (Portugal) savanna-like: Bias ~ 0.5K & RMSE ~1.5K
- However, emissivity is a major source of LST uncertainty in arid regions (2.5K or more)
- There are other methods under testing / used for direct retrieval of LST & EM from IR imagers
  - Feasibility study ongoing: Kalman Filter (logit of SEVIRI emissivity & LST); sensitive to EM 1st guess!

Masiello, et al. (2015), in Atmos. Meas. Tech., 8, 2981–2997, doi: 10.5194/amt-8-2981-2015

- Better characterization of Land Surface Emissivity would benefit all the above!

## IASI: LST & Emissivity Spectra Physical Retrieval:

- 1st guess: Emissivity spectra based on MODIS & spectral libraries; Tskin (ERA-40)
- Estimates  **$P=10$  Emissivity PCs** &  **$\Delta T$**  [LST – Tskin], assuming atmosphere is known
  - Only 512 window channels are considered
  - “Unstable solutions”  **$\Delta T > 20$  K** are filtered out
- Verification via comparison:
  - Between simulated radiance spectra & IASI observations
  - Retrieved IASI LSI, 1st Guess & LSA-SAF
- **Such method may be used to derive a emissivity spectra climatologies – to be used in land (or atmospheric profiles) retrievals**
- **To be solved/ checked:**
  - **Improve atmospheric profiles**
  - **Downscaling/ rescaling emissivity**
  - **Emissivity dependence on zenith angle**

<http://lsa-saf.eumetsat.int>

[isabel.trigo@ipma.pt](mailto:isabel.trigo@ipma.pt)

[filipe.aires@obspm.fr](mailto:filipe.aires@obspm.fr)

