

A satellite image of Earth showing the Western Hemisphere, including North and South America, the Atlantic Ocean, and the Indian Ocean. The image is partially obscured by a dark blue text box on the right and a white curved graphic element on the left. A white circle highlights a specific region in the lower-left quadrant of the image.

# An infrared emissivity atlas based on IASI

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## Motivation

Why another emissivity atlas?

## The linear programming (LP) emissivity retrieval approach

Representation of emissivity as a convex combination of emissivity base spectra.

## Challenges

Need for very strict cloud screening.

## Comparison with Camel

## Wrap up (still work in progress)

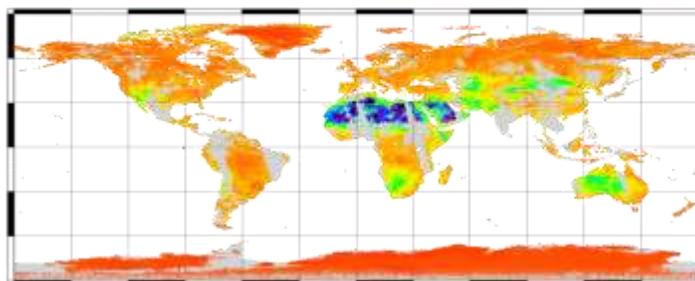
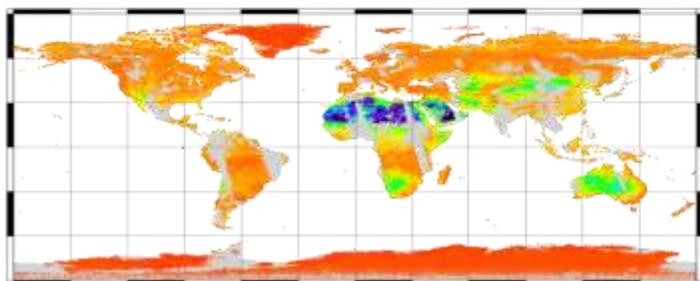
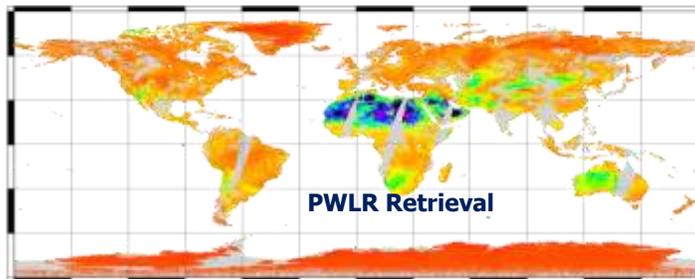
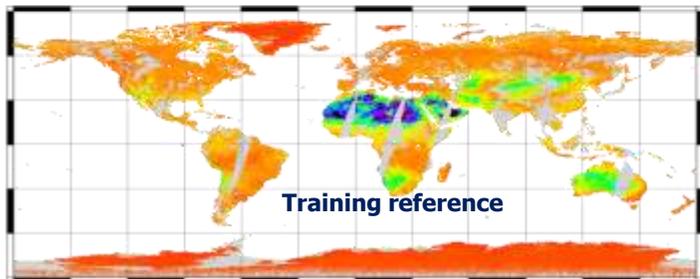


# Piece Wise Linear Regression retrieval of emissivity

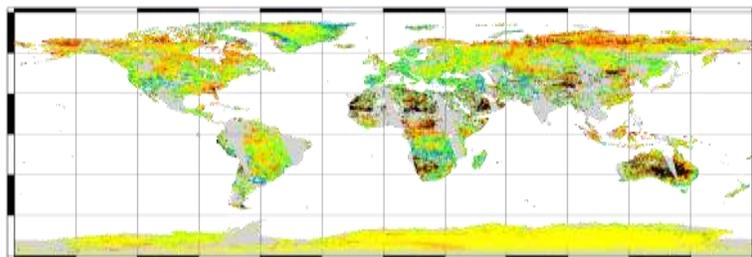
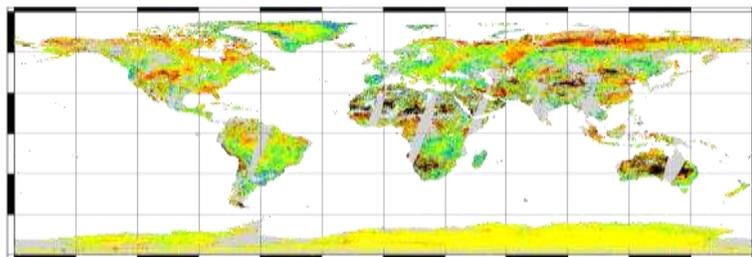


Modis Emissivity (1204.8 cm-1) 20120701

Iasi Emissivity (1204.8 cm-1) 20120701



Modis-Iasi Emissivity (1204.8 cm-1) 20120701

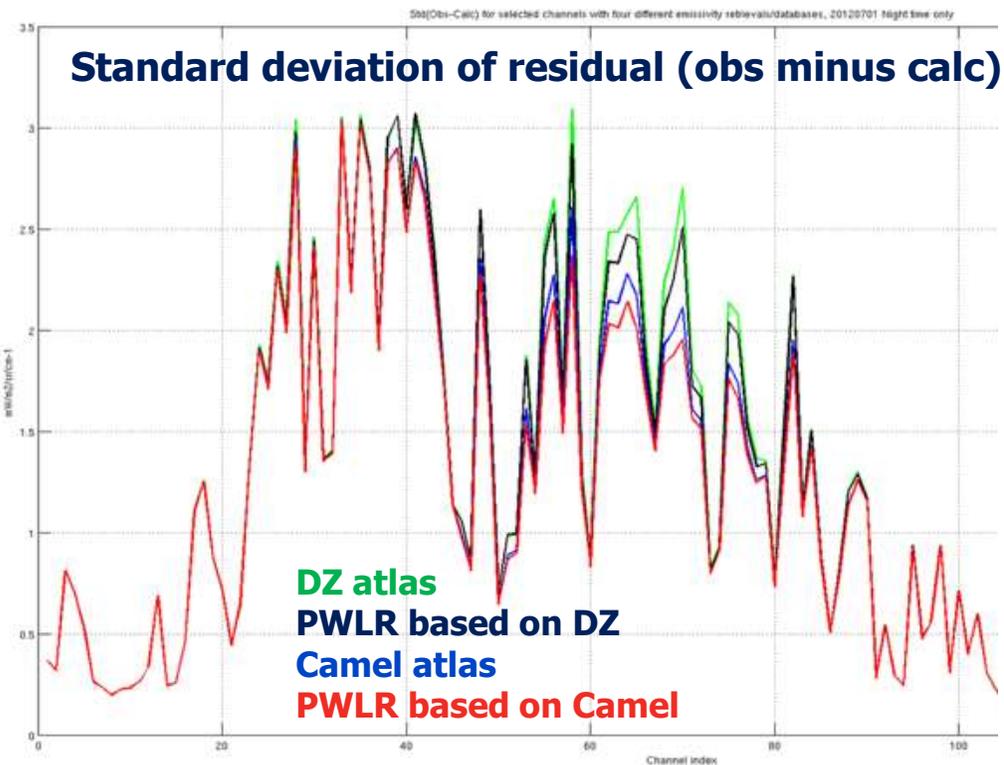


Consistent differences between PWLR retrieval and training atlas day and night

PWLR retrieval trained with Camel atlas:

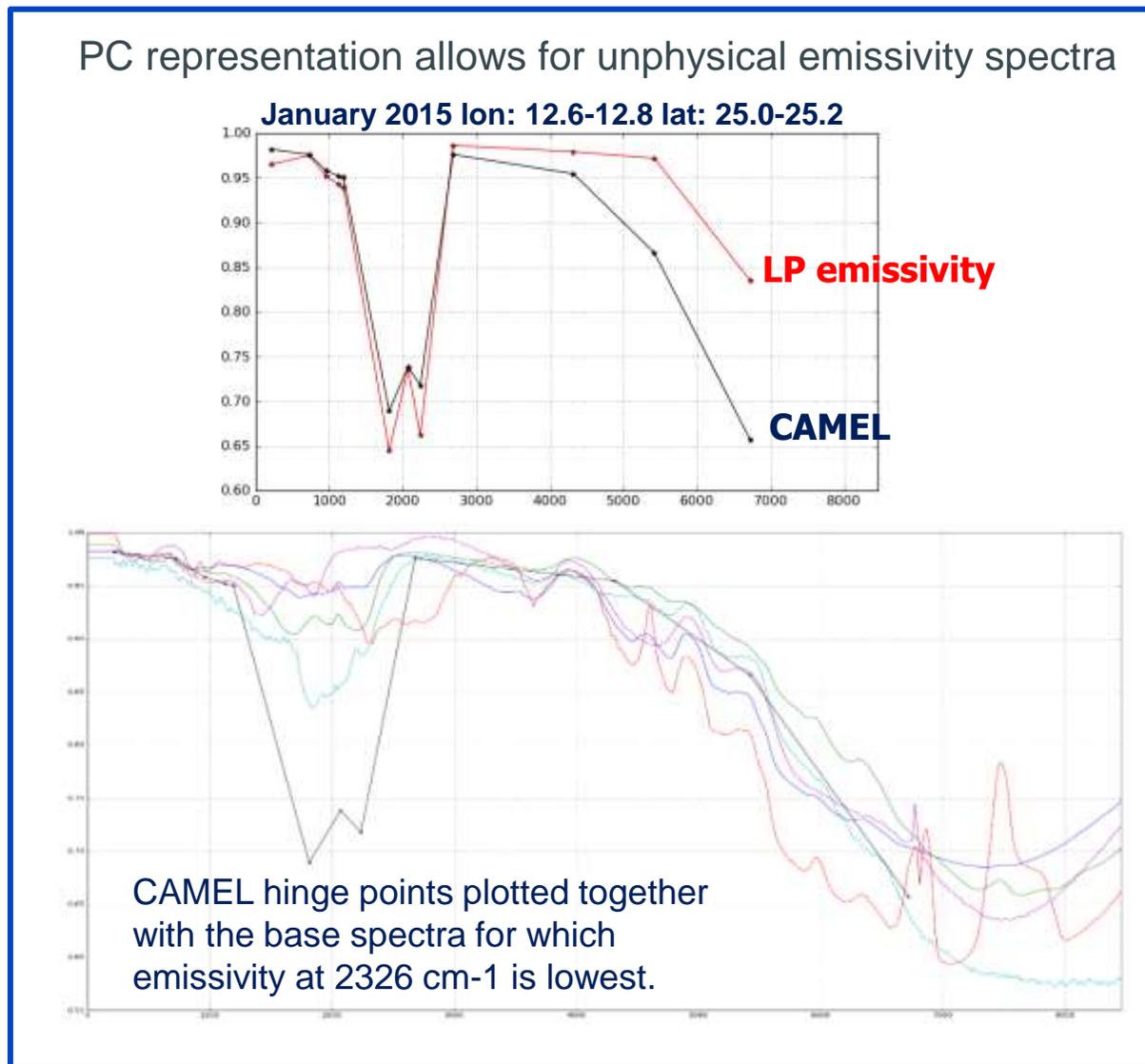
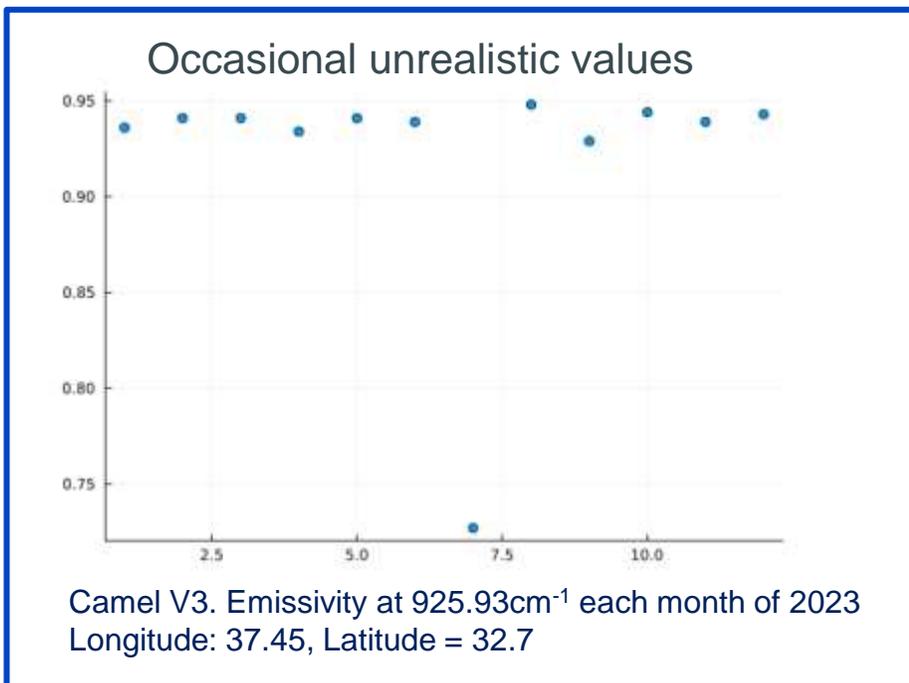
- Just giving back the atlas? Or is there added value?

Analysis of obs – calc for different sources of emissivity sources shows that the PWLR retrieval can improve upon the atlas





- Integrated in RTTOV. Based on Modis and Aster. Provides emissivity on 13 wavenumbers. PC expansion to emissivity spectra (698-2778  $\text{cm}^{-1}$ ).



- Hyperspectral Infrared Emissivity Atlas is needed
- Current de facto standard atlas (Camel V3) has some weaknesses
- Hyperspectral data might help determine the emissivity spectral shape



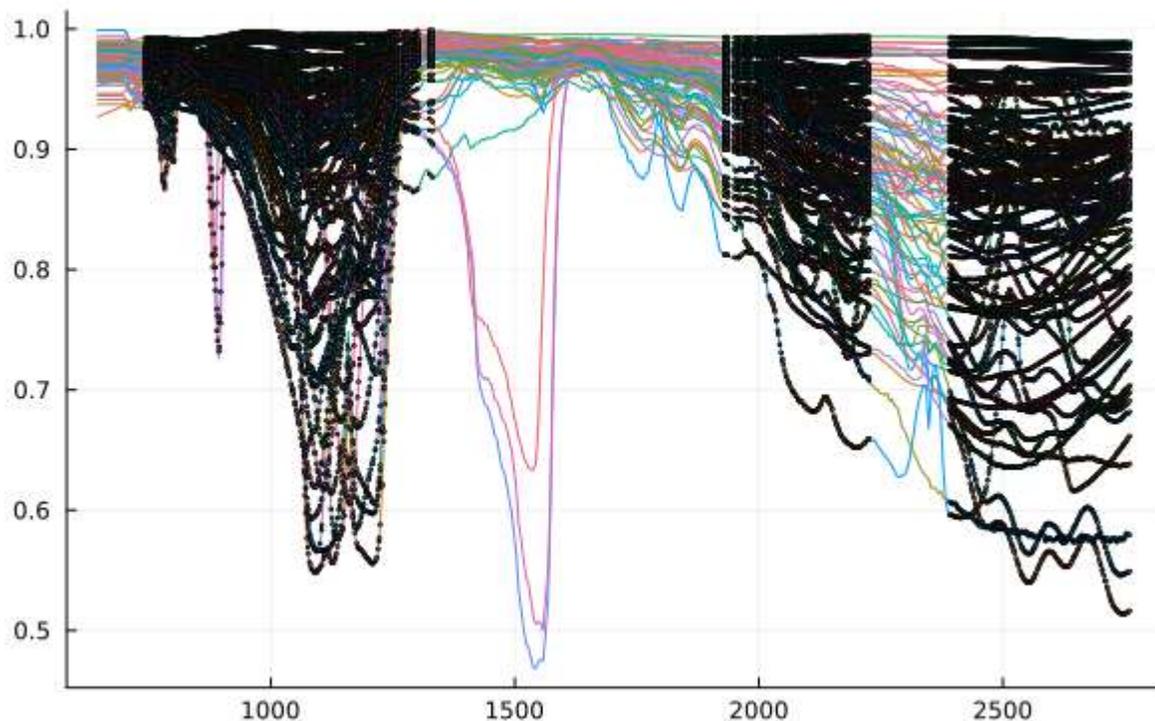
# Low dimensional representation of emissivity

Convex combination: linear combination where all coefficients are non-negative and sum to 1



$$= 0.5 \text{ [soil]} + 0.2 \text{ [sand]} + 0.3 \text{ [vegetation]}$$

Base emissivity spectra



## Configuration

- 87 base emissivity spectra from ASTER spectral library (the ones used for Camel PCs)
- 589 surface sensitive channels (rejecting channels if the emissivity Jacobian is less than 0.6 times the simulated radiance)



# Simultaneous retrieval of $t_s$ and $e$ by fitting radiances

In each clear sky pixel take:

- $y$  the (noise filtered) measured radiances
- $x$  an estimate of the state (obtained without radiance fitting)
- $r^x$  the simulated radiances  $F(x)$  obtained by applying a forward model  $F$  to  $x$
- $K^{ts}$  the Jacobian wrt surface skin temperature
- $K^e$  the Jacobian wrt emissivity

Want corrections  $\Delta t_s$  and  $\Delta e$  to  $t_s$  and  $e$  from  $x$  such that  $r = r^x + K^{ts}\Delta t_s + K^e\Delta e$  is close to  $y$

For fixed  $\Delta t_s$  we can match  $y$  by setting  $\Delta e = (r^x + K^{ts}\Delta t_s - y)_i / K^e_i$

**Need regularization by restricting the feasible space of  $e + \Delta e$**

**PC representation:**

$$e + \Delta e = e_m + E_e p$$

**Convex combination representation:**

$$e + \Delta e = E_b \lambda \text{ with } \lambda \geq 0 \text{ and } \sum \lambda = 1$$

Minimize  $\sum |r - y|$

Subject to

$$r = r^x + K^{ts}\Delta t_s + K^e E_b (\lambda - \lambda_0)$$

$$\sum \lambda = 1$$

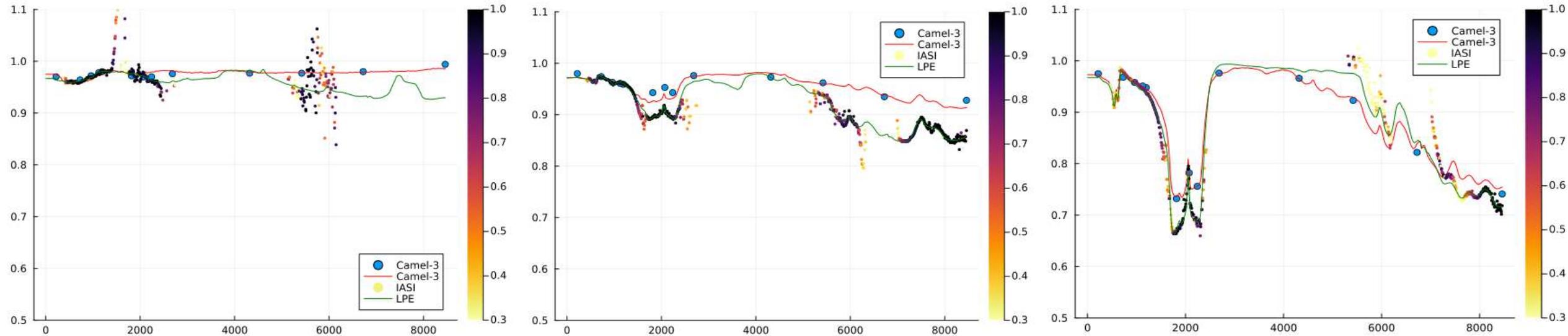
$$\lambda \geq 0$$

Easy to state and solve in C++ (FLOPC++) or Julia (JuMP)

Can be formulated as a linear program (LP) with objective function  $\min \sum |r - y|$

# Three selected (nighttime) cases

Each dot shows individual channel emissivity retrieval to fit measurement (with fixed  $\Delta t$ s)  
The colour indicates value of  $K_i^e / r_i^x$  (surface sensitivity)



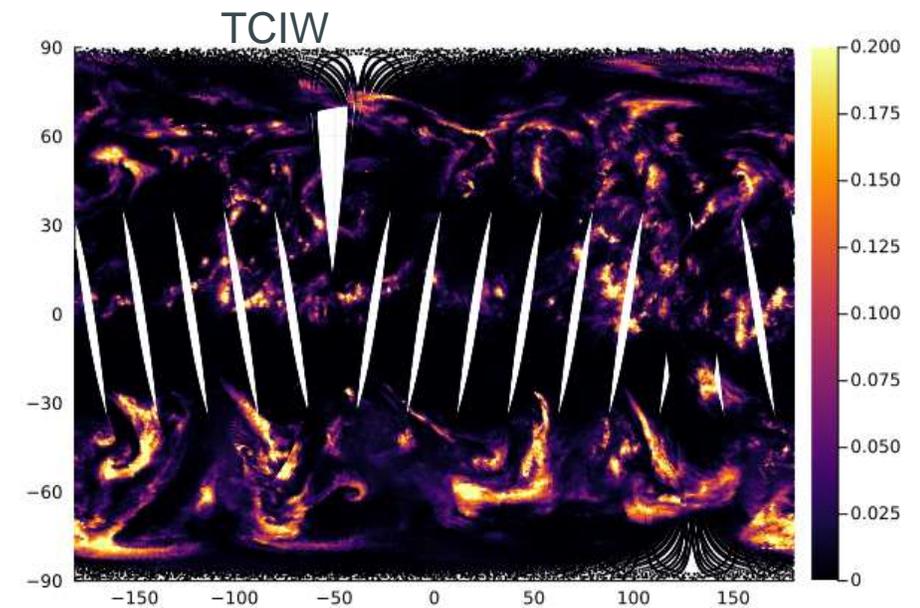
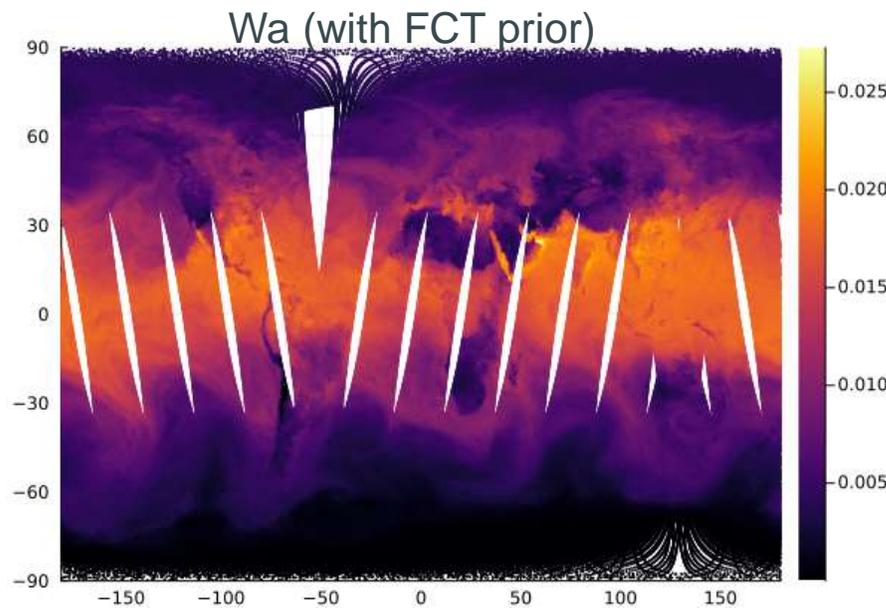
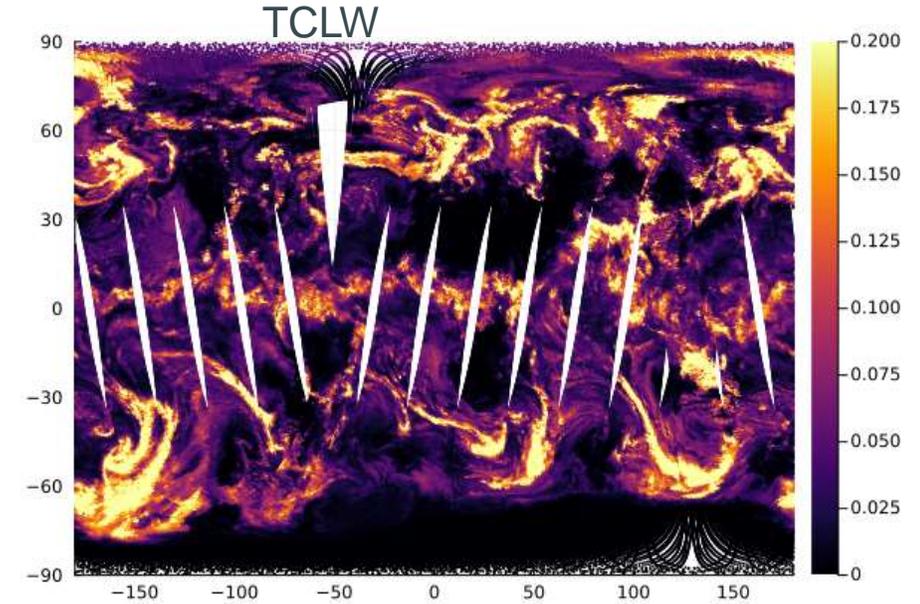
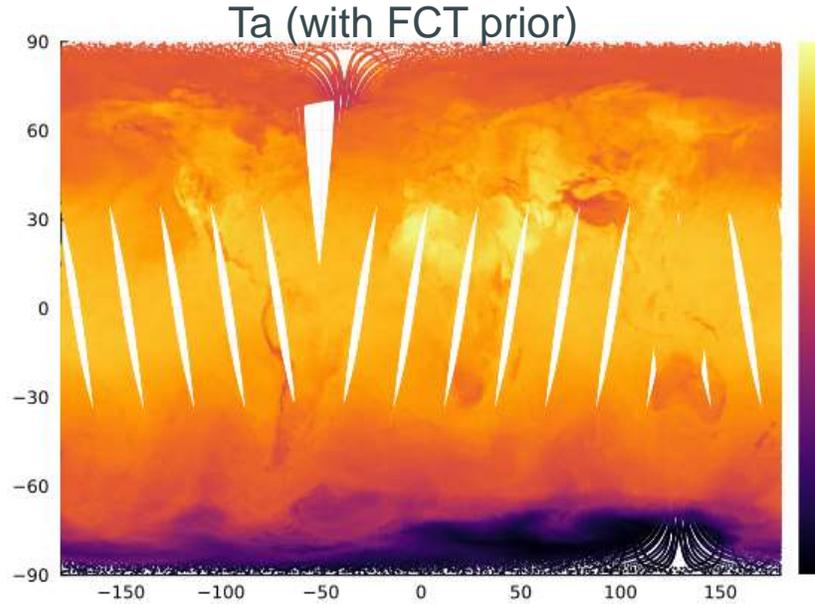
- Only nighttime shortwave radiances are reliably simulated
- Big impact of noise for shortwave in cold scenes
- Aerosols / ozone / CO
- Strict cloud screening needed

Good quality profiles are needed

- Which have not been obtained by fitting the measurements

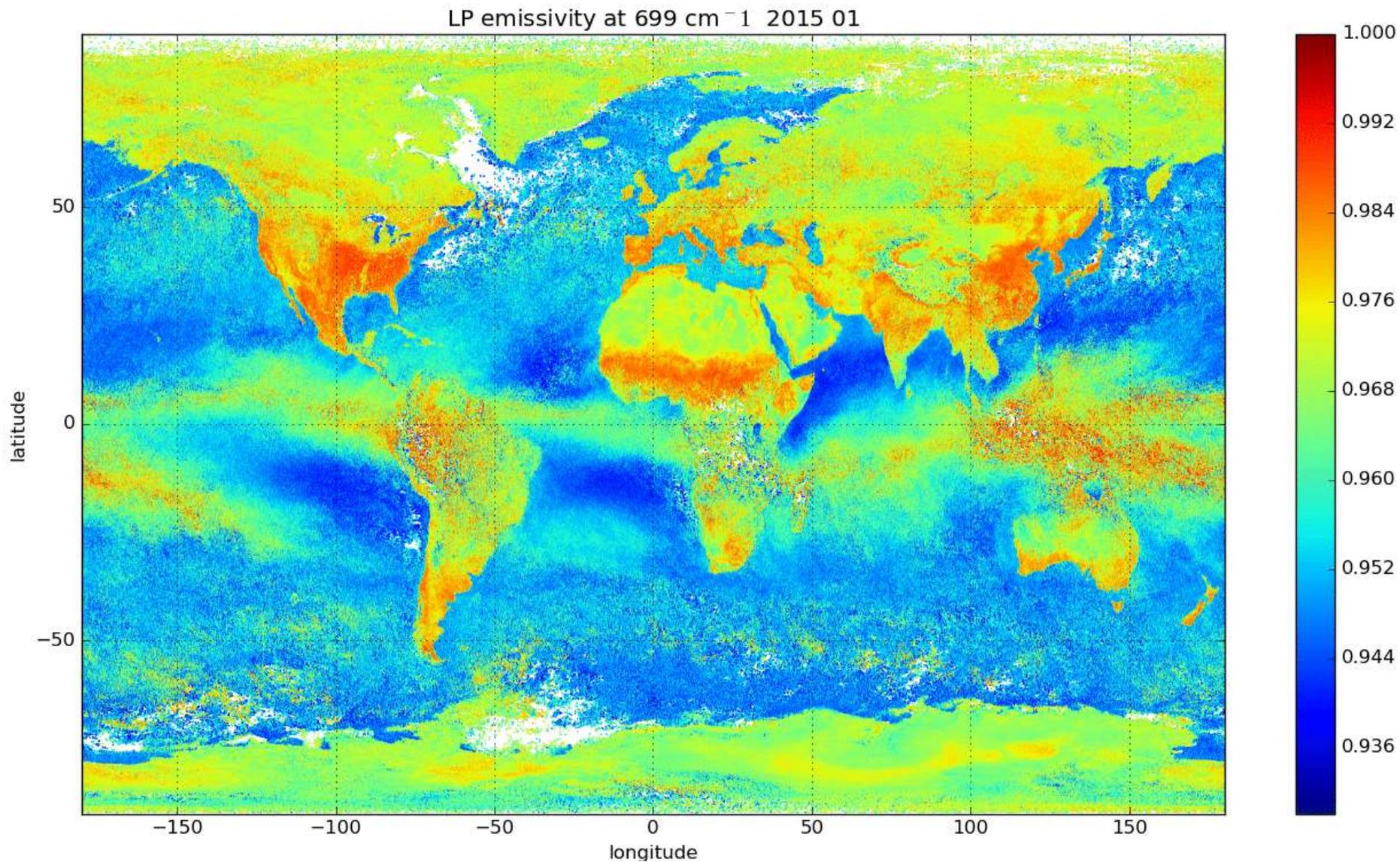
IASI L2 V7 processor (PWLR):

- ML trained with real IASI and collocated ECMWF profiles
- Profiles at 137 model layers
- TCLW and TCIW added
- T and W profiles with FCT prior information on fine scale vertical structures in the null space added in **addition** to the usual forecast free profiles
- 4.5 TB/year (per satellite)





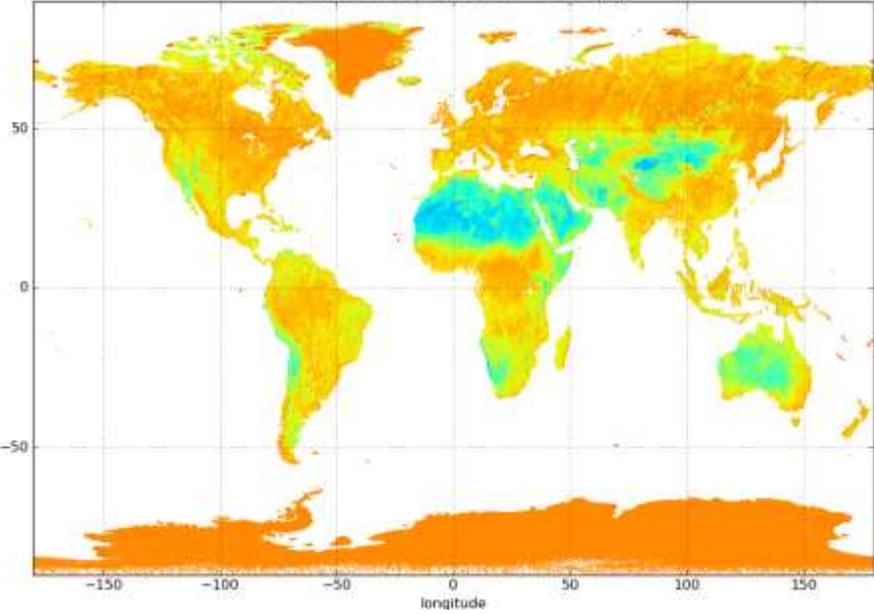
# (Insufficient) cloud filtering



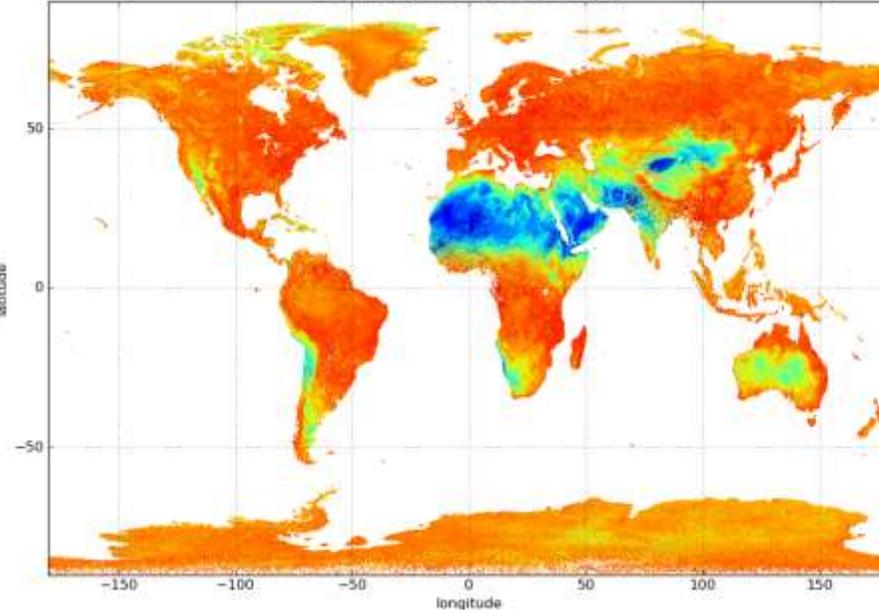


# Comparison at 926 cm<sup>-1</sup>

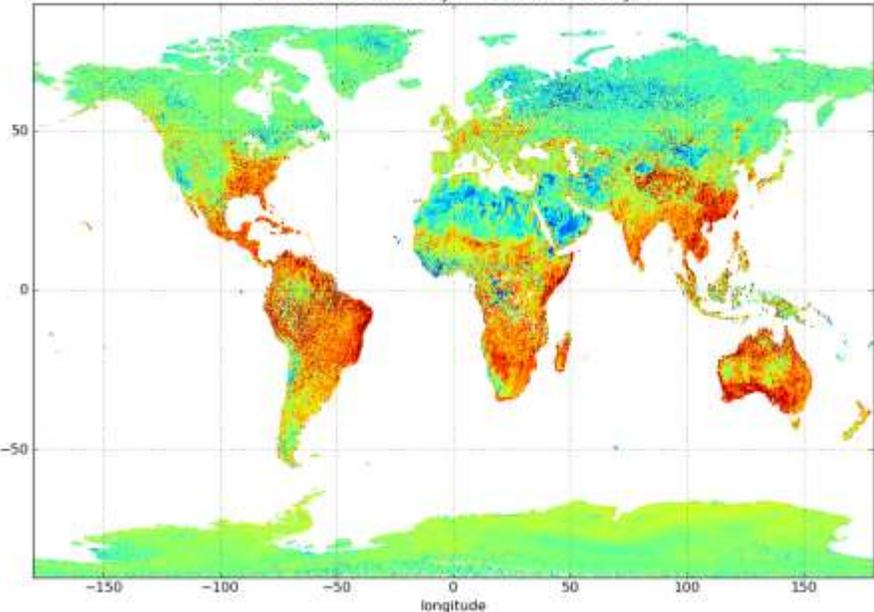
CAMEL emissivity at 926 cm<sup>-1</sup> 2015 July



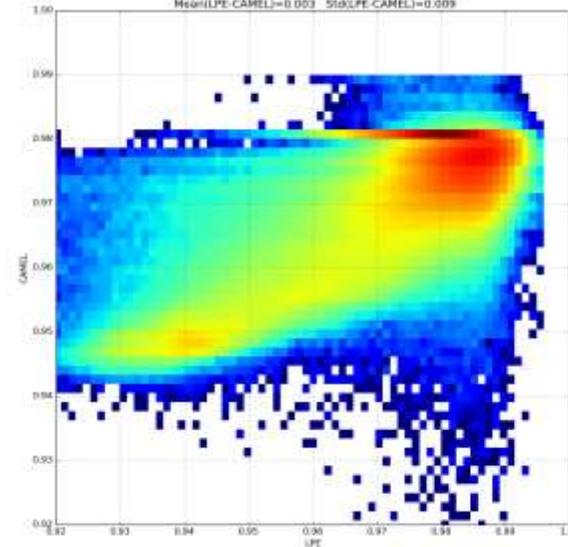
LP emissivity at 926 cm<sup>-1</sup> 2015 July



LPE - CAMEL emissivity at 926 cm<sup>-1</sup> 2015 Jan



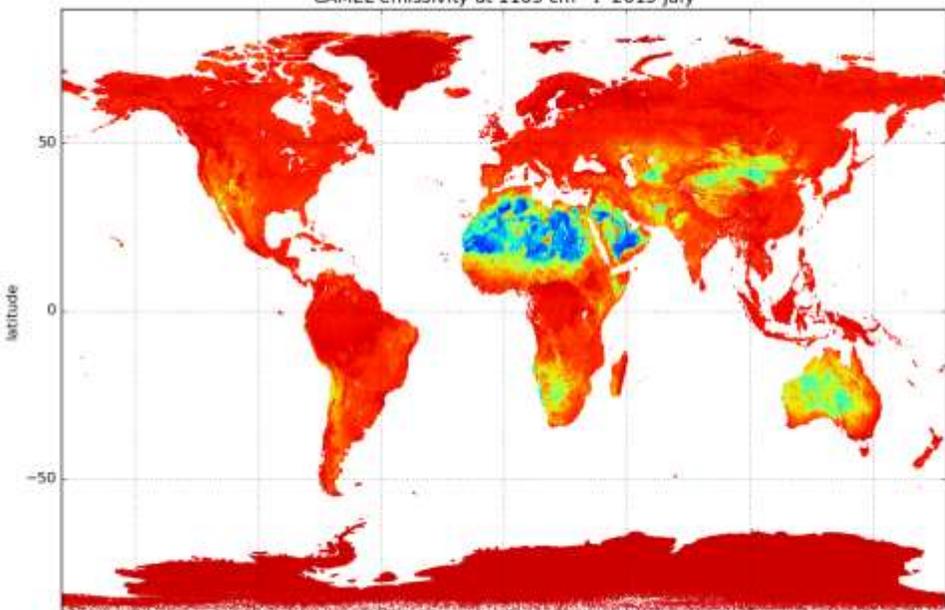
2015 July  
LPE vs CAMEL emissivity at 926.0 cm<sup>-1</sup>  
Mean(LPE-CAMEL)=-0.003 StDev(LPE-CAMEL)=0.009



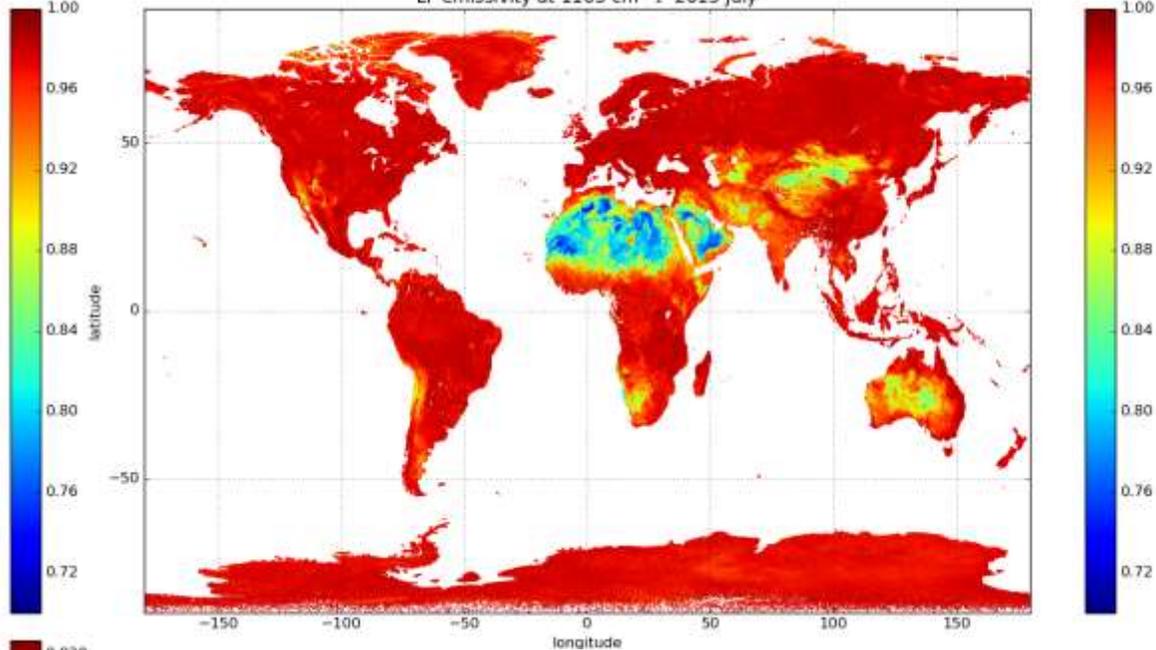


# Comparison at 1163 cm<sup>-1</sup>

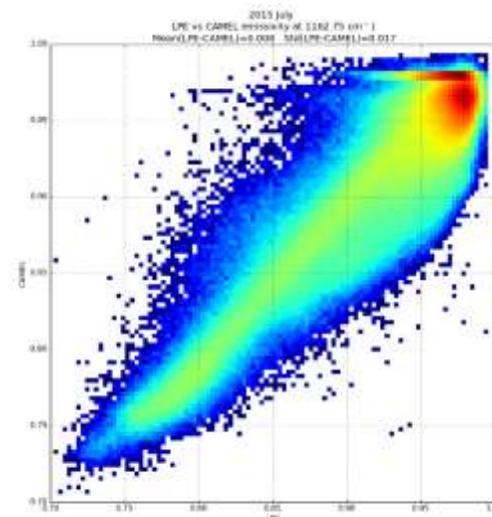
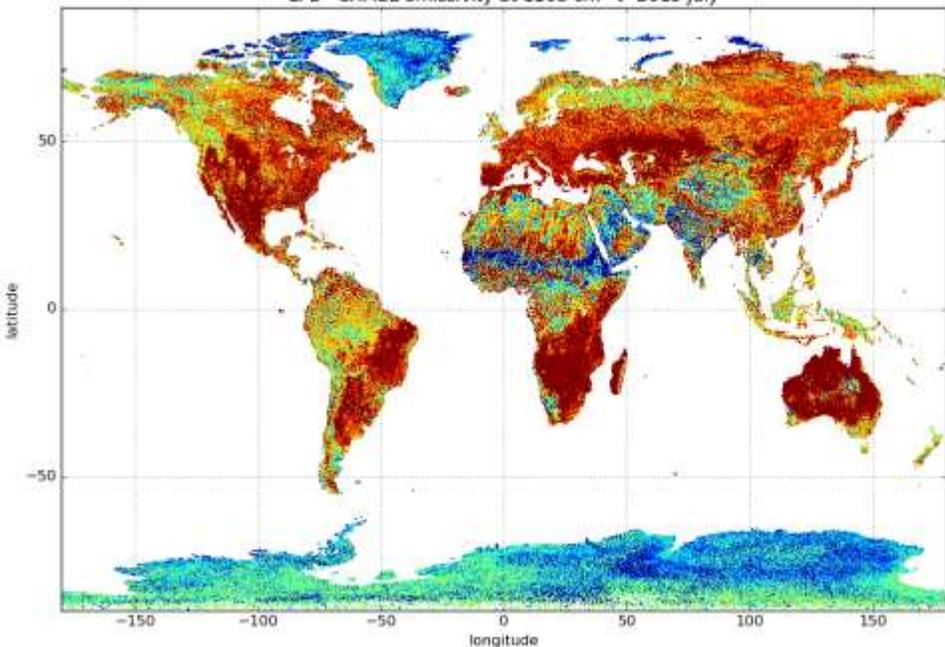
CAMEL emissivity at 1163 cm<sup>-1</sup> 2015 July



LP emissivity at 1163 cm<sup>-1</sup> 2015 July

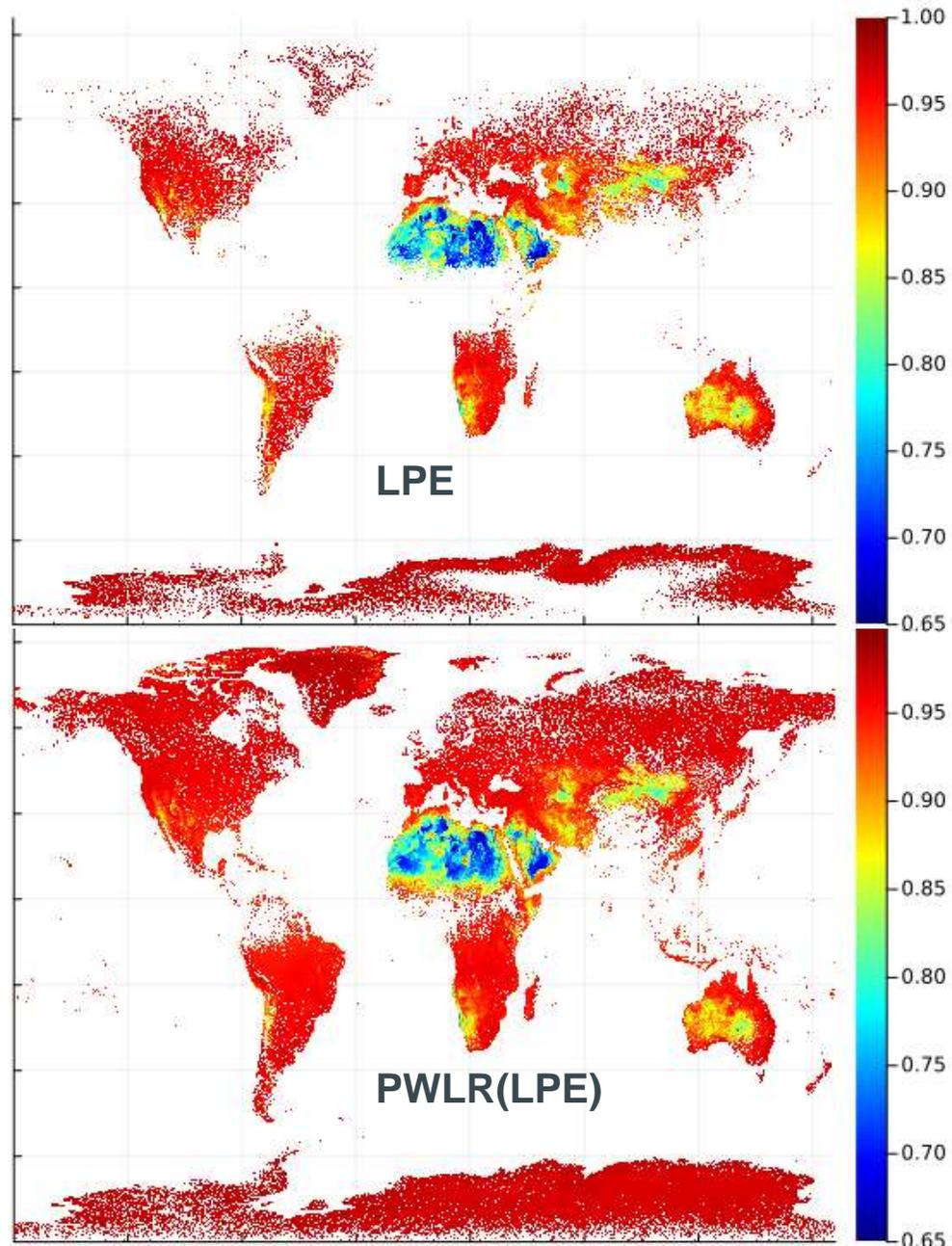


LPE - CAMEL emissivity at 1163 cm<sup>-1</sup> 2015 July



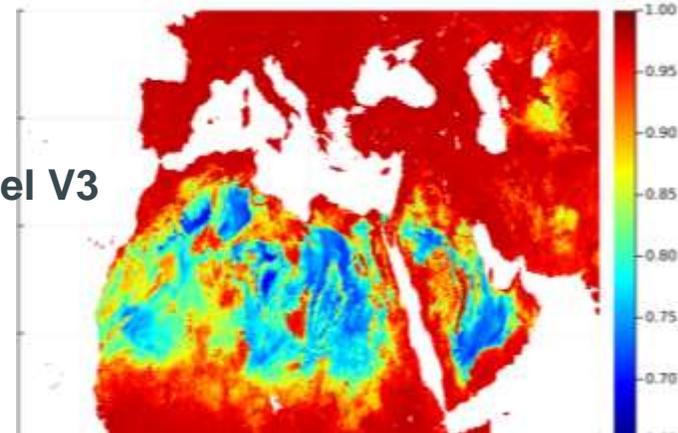


# First month of new atlas, fresh from the computer...

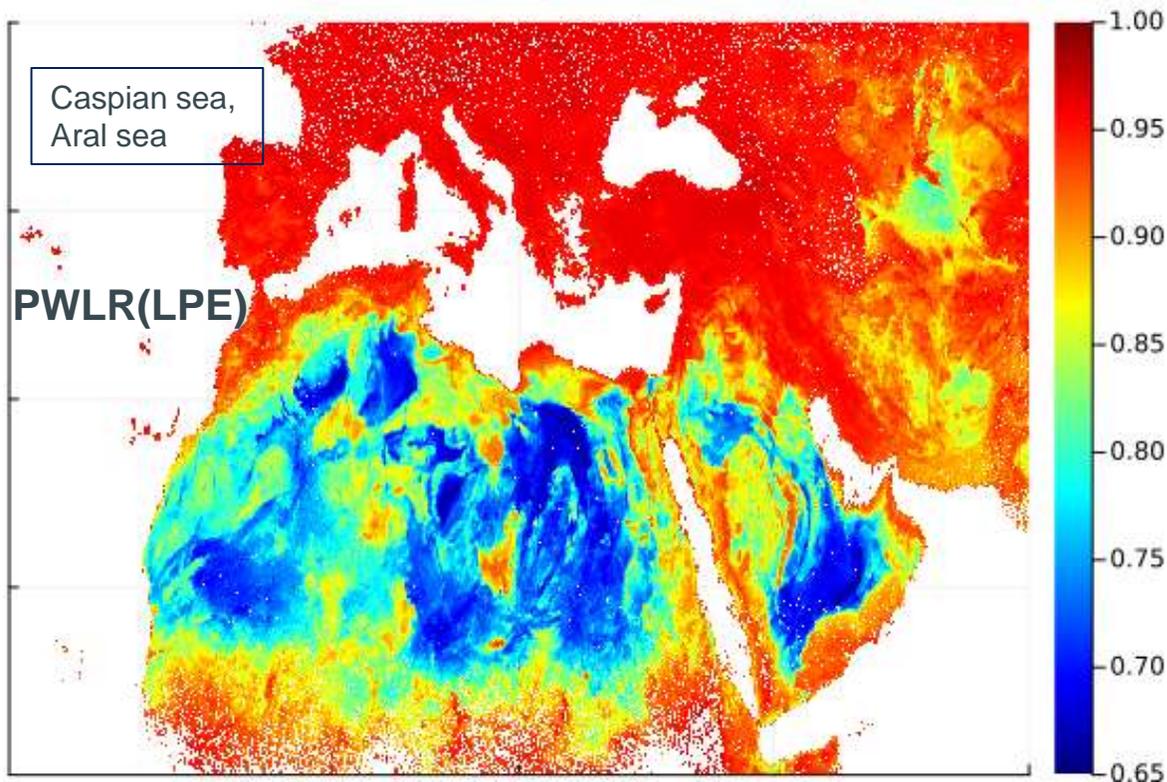


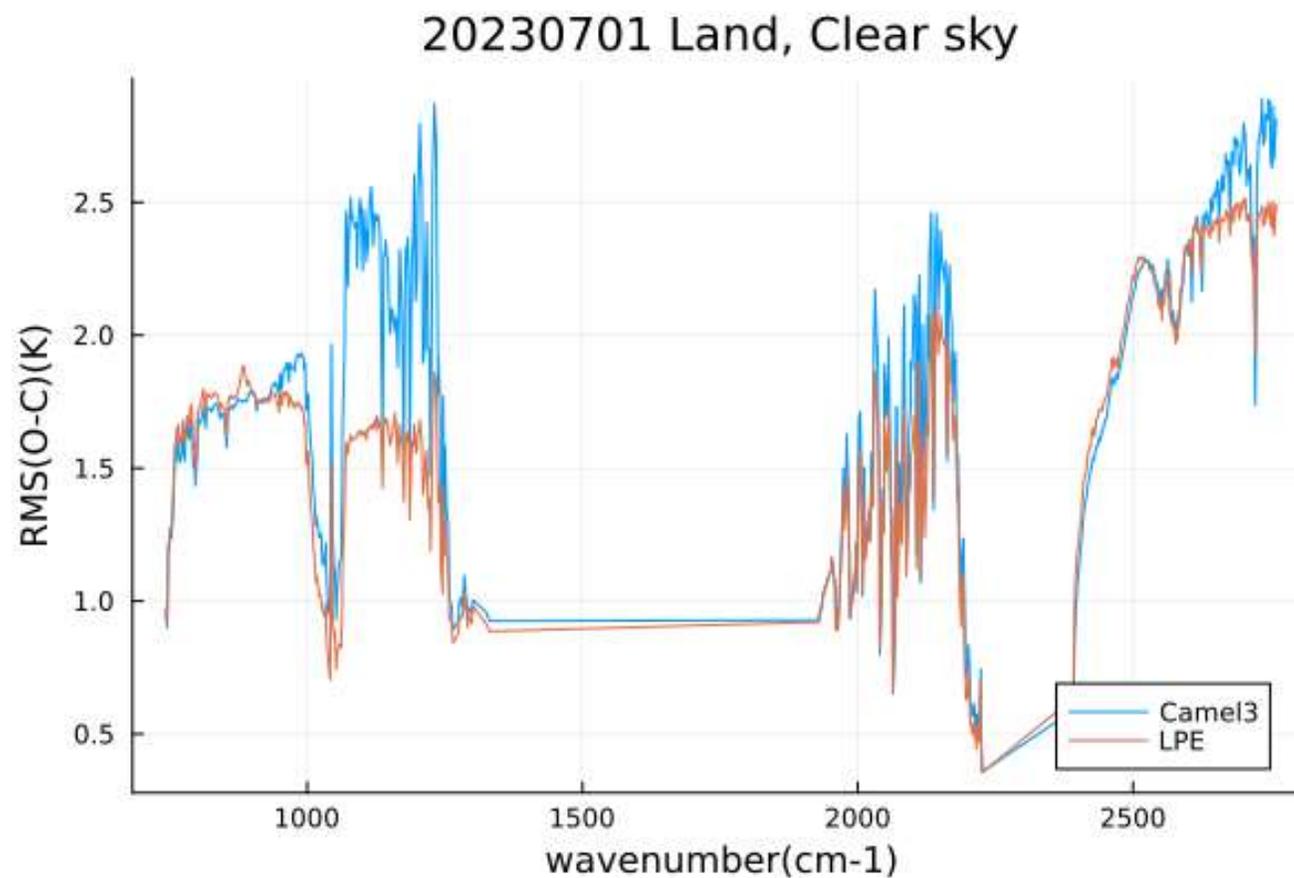
July 2023 at 1099  $\text{cm}^{-1}$

Camel V3



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- Using LP for retrieval is cool – and hopefully beneficial...
- Main purpose of atlas to serve as training data for PWLR, but we also plan to make it publicly available
- Not yet ready for general distribution (one year of M01 V7 profiles and emissivity retrievals done – atlas to be compiled and checked)
- Spatial resolution 0.1 times 0.1 degree or 0.5 times 0.5 (as Camel)?
- Cloud screening trade off?
- Validation?
- Feedback and pilot users are welcome