

# Recent progress of the long-wave infrared instrument for atmosphere monitoring within the StarDICE experiment

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Rubin LSST-France meeting @ CC-IN2P3 Lyon | 13-15/12/2023



# ● Content

1. **Why using an infrared thermal camera ?**
2. **Goals**
3. **Radiometric calibration**
4. **Overview of first observations**

## ● Definitions and notations

- **LWIR** : Long-Wave Infrared band  $\sim 7 - 14 \mu\text{m}$
- **Radiance** : radiant flux emitted, reflected, transmitted, or received by a surface, per unit solid angle per unit projected area = **L** in  $\text{W}/\text{m}^2/\text{sr}$
- **Spatial noise** : standard deviation of a single complete image
- **Temporal noise** : standard deviation of a single pixel value on consecutive images for a supposed constant scene radiance
- **Cloud optical depth  $\tau$**  : measure of the attenuation of light due to cloud particles along a given path
- **Radiometric**  $\Rightarrow$  LWIR thermal camera (sky measurements)
- **Photometric**  $\Rightarrow$  UV-VIS-NIR w/ CCD camera (stars measurements)

# 1. Why using an infrared thermal camera ?

## 1.1 “Gray” extinction as a limiting systematic

$$F_{\text{SD}} = \int_{\lambda} S_{\star}(\lambda) \times R_{\text{SD}}(\lambda) \times T_{\text{atm}}(\lambda) \times t_{\text{exp,SD}} \times A_{\text{mirror,SD}} \times \frac{\lambda d\lambda}{hc}$$

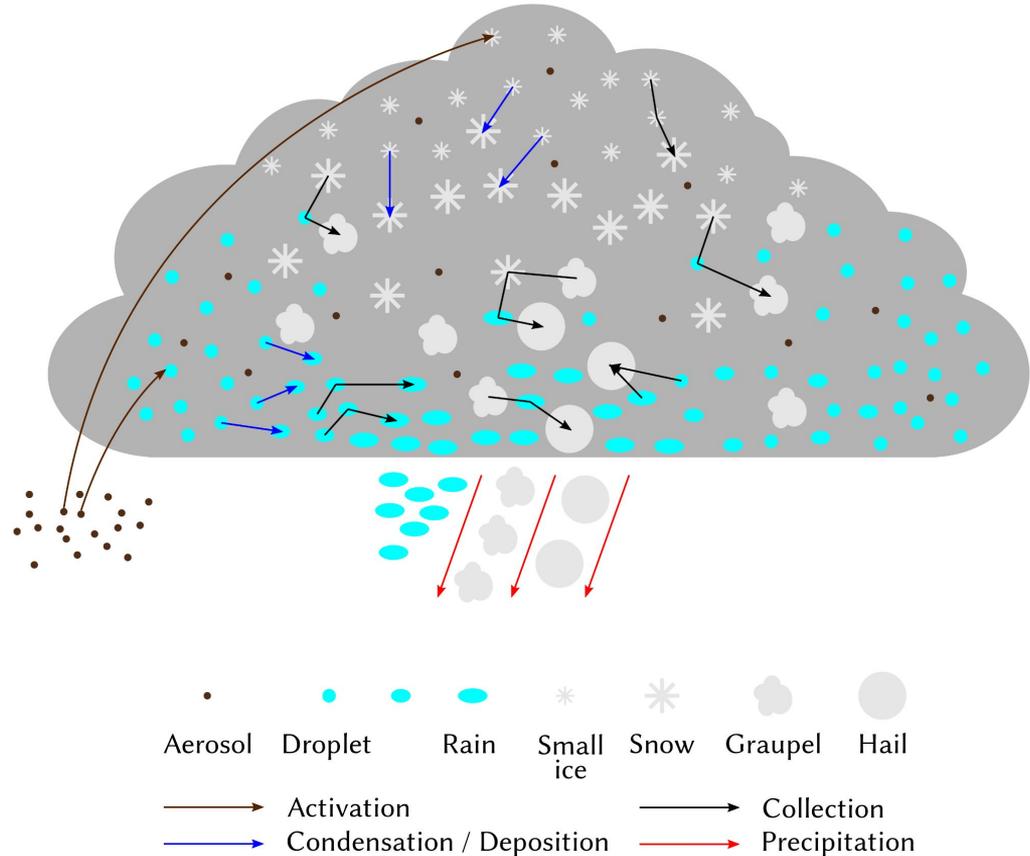
$$T^{\text{atm}}(\text{alt}, \text{az}, t; \lambda) = T_{\text{gray}} e^{-z(\text{alt}) \cdot \tau_{\text{aerosol}}(\text{alt}, \text{az}, t; \lambda)} \\ \times (1.0 - C_{\text{mol}}(BP(t)/BP_0) A_{\text{mols}}(z(\text{alt}); \lambda)) \\ \times (1.0 - \sqrt{C_{\text{mol}} BP(t)/BP_0} A_{\text{mola}}(z(\text{alt}); \lambda)) \\ \times (1.0 - C_{\text{O}_3} A_{\text{O}_3}(z(\text{alt}); \lambda)) \\ \times (1.0 - C_{\text{H}_2\text{O}}(\text{alt}, \text{az}, t) A_{\text{H}_2\text{O}}(z(\text{alt}); \lambda)).$$

- Empirical wavelength-independent “gray” normalization  $T_{\text{gray}}$  is fitted for each observation (Burke et al. 2010) → **insufficient as calibration is limited by a rapidly changing conditions with moving and evolving cloud cover**
- Given by spectra + local measurements + radiative transfer simulations

## 1.2 What is causing “gray” extinction ?

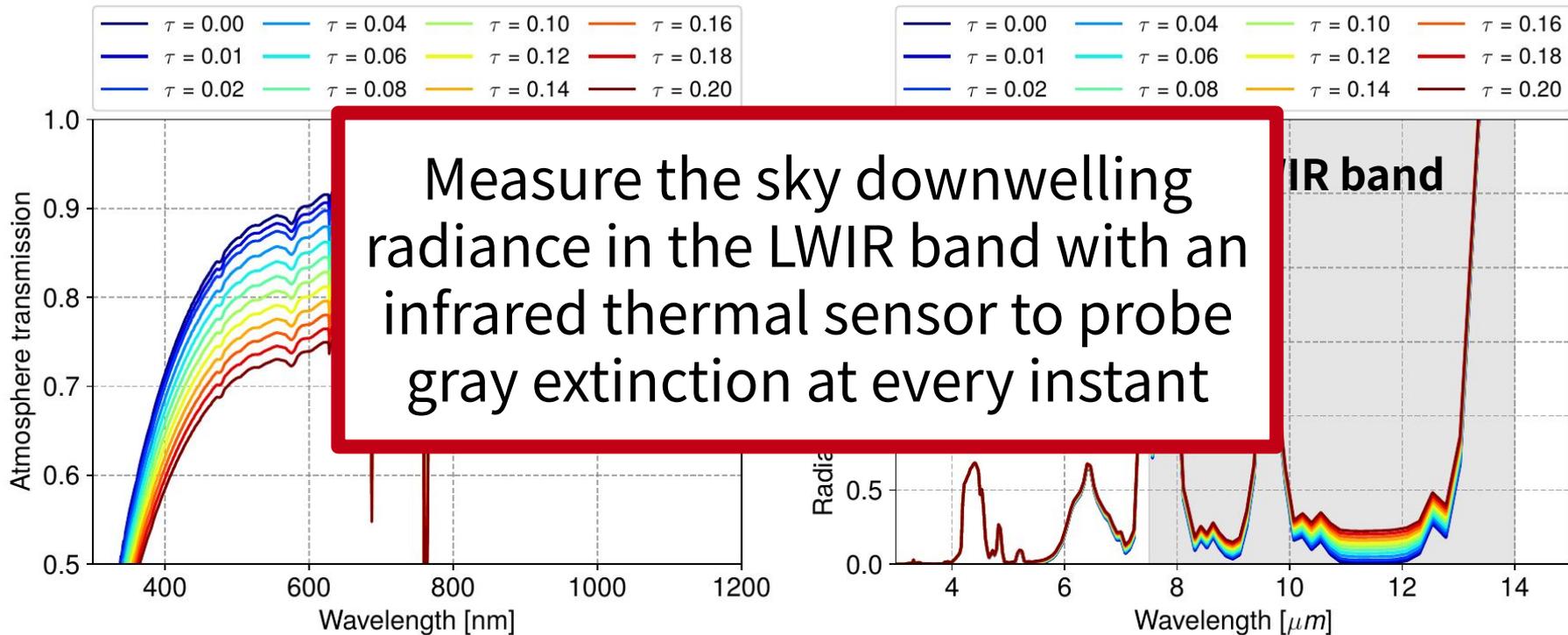
Ice crystals and water droplets in clouds :

- Produce shadows that appear as “gray” in UV-VIS-NIR (independent of wavelength)  $\Rightarrow$  **decrease in atmosphere transmission**  $\Rightarrow$  decrease in stellar source flux
- Produce thermal emission  $\Rightarrow$  **increase in radiance / brightness temperature**



# 1.3 Effect on UV-VIS-NIR photometry and LWIR radiance

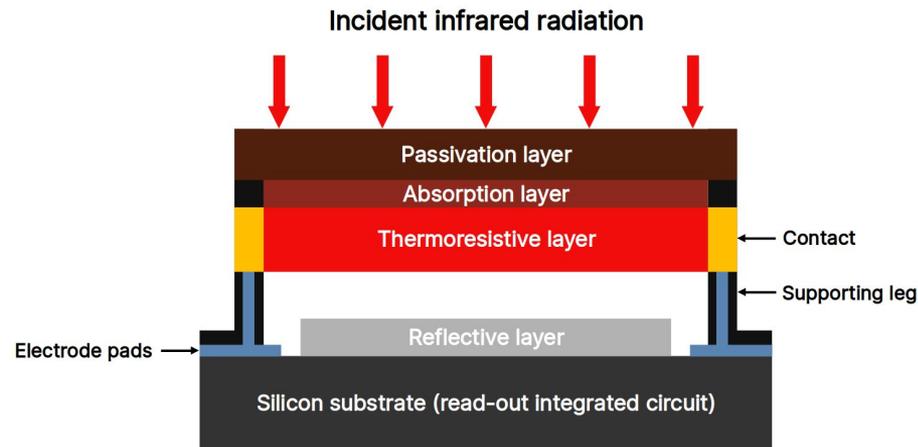
→ Measuring the sky radiance in LWIR band appears as a potential solution



Credits: Sylvie Dagoret-Campagne

## 1.4 Description of the instrument

- 640 x 512 pixels uncooled microbolometers focal plane array
- Large FOV = 10.4 x 8.3 deg
- 8.33 Hz imaging rate  $\Rightarrow$  ~ 80 GB/night
- Radiometrically calibrated radiance images in radiances  $\text{W/m}^2/\text{sr}$

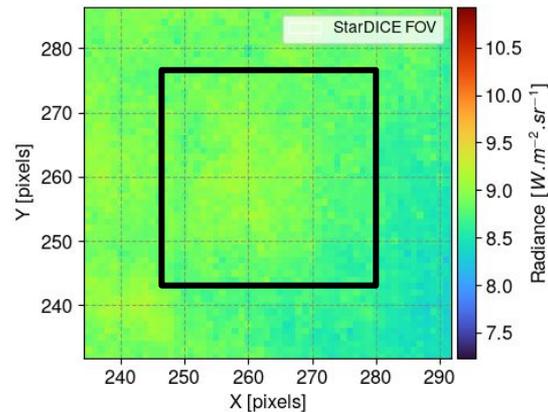
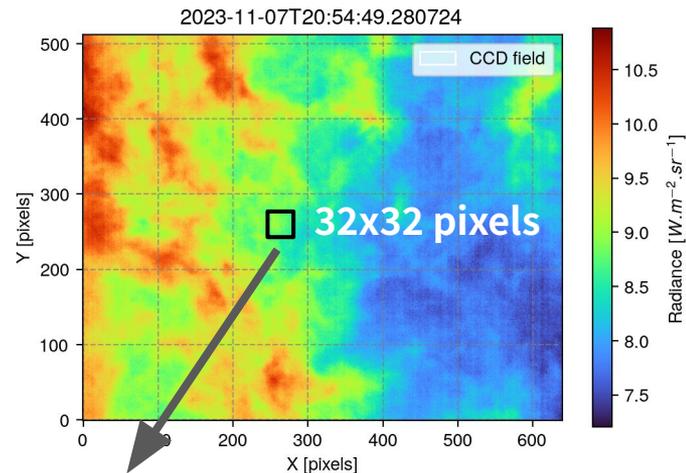
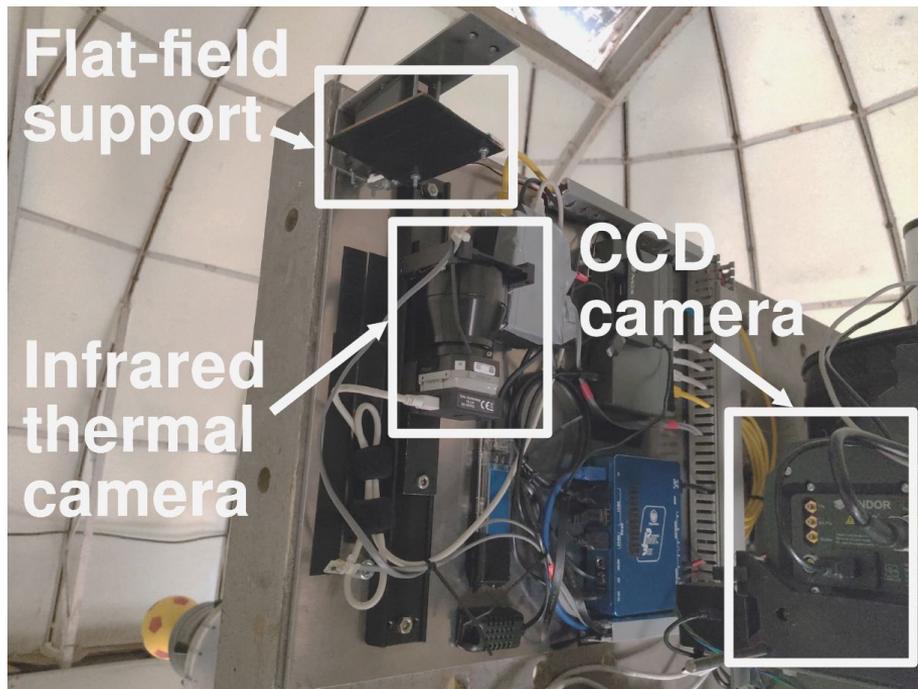


Voltage change      Gain      Scene radiance      Offset

$$\Delta V = A \times L_{s2} + B(L_{pix})$$

Does definitely not work like a photon counting sensor !

# 1.5 Infrared instrument installed @ OHP



## 2. Goals

## 2.1 Short-term goal(s)

- Identify spectro/-photometric exposures affected by gray extinction / clouds

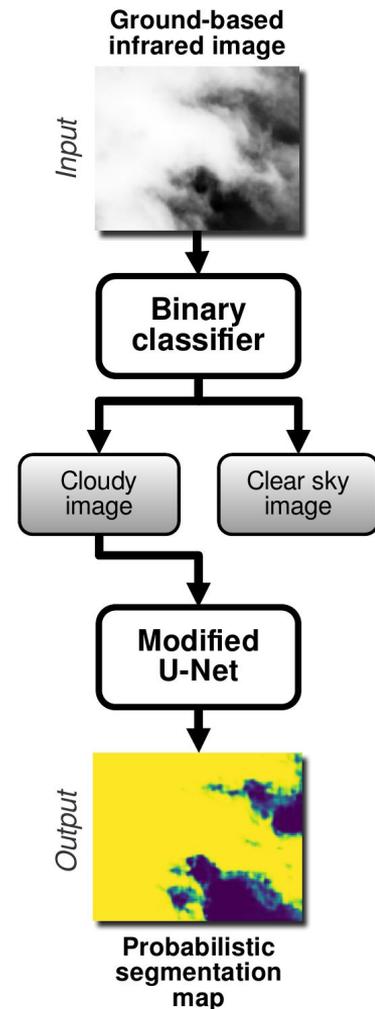
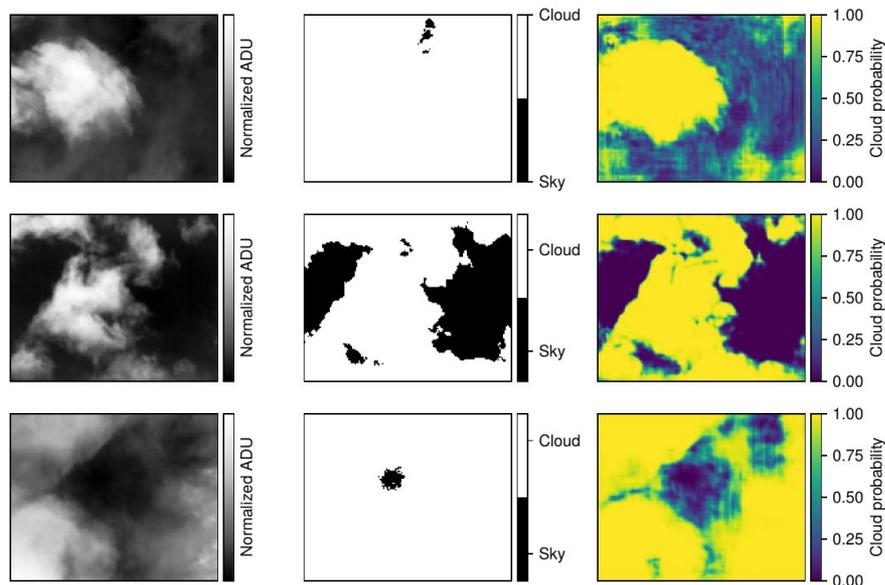
→ classification, cloud structure detection / image segmentation

→ flag them and remove them from the analysis

### Infrared Radiometric Image Classification and Segmentation of Cloud Structure Using Deep-learning Framework for Ground-based Infrared Thermal Camera Observations

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*In prep.*

*Atmosphere Measurement Techniques, European Geosciences Union (AMT Copernicus)*



## 2.2 Long-term goal(s)

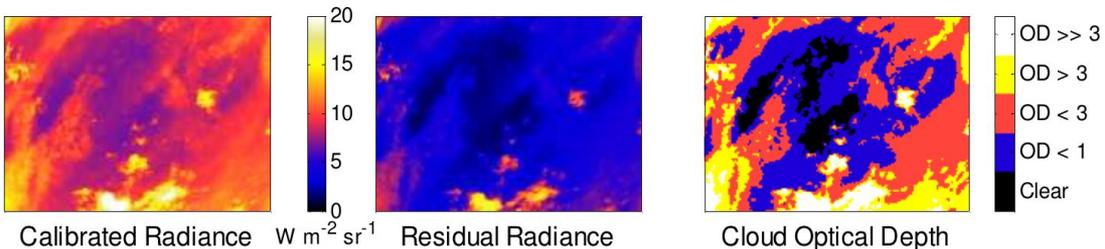
- Correct photometry for spurious variations

→ find a method to produce the quantitative metric  $T_{\text{gray}}$

→ comparisons with simulations: sky background radiance removal to derive the gray extinction component

→ joint-analysis with other data: observed spectrum, lidar, AERONET to fit the atmosphere

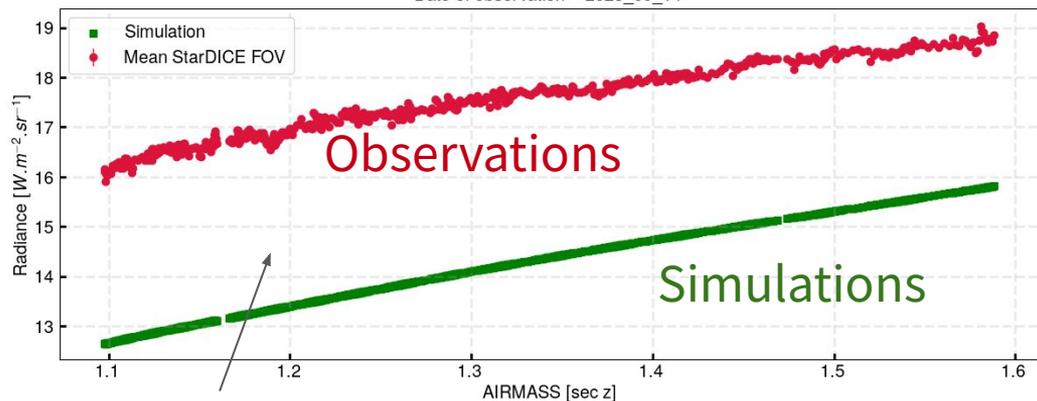
→ correct sub-regions of CCD images



Source: Nugent et al. 2009

### Sky thermal IR radiance

Date of observation = 2023\_09\_14



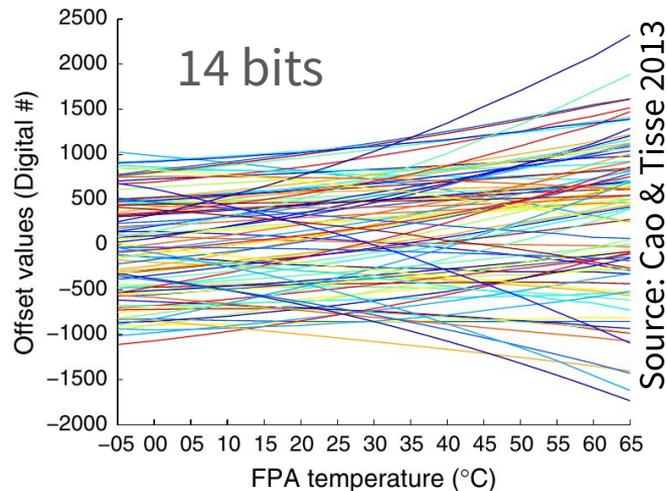
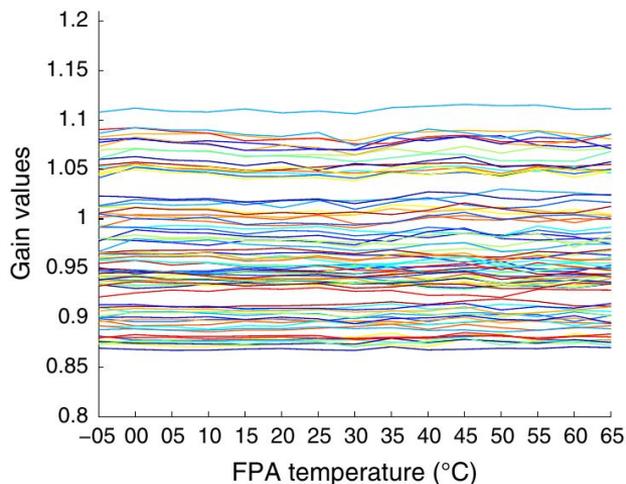
Discrepancy: calibration ? simulation ? both ?  
→ work in progress

# 3. Radiometric calibration

## 3.1 Motivation

### Why calibrating the camera ?

- Correct for camera gain and offset drifts
- Compare nights between each other
- Compare to simulations of sky radiance to evaluate the background level (e.g. libRadTran radiative transfer code)



## 3.2 Method

### How ?

- Acquire data with a controlled thermal source (e.g. blackbody surface with known temperature and emissivity)
- Put the camera at different ambient temperatures inside a controlled area
- Fit a set of calibration parameters  $\theta$  of the model  $L_{\text{model}}$  on the expected scene radiance  $L_{\text{scene}}$

$$-2\ln(\mathcal{L}) = \chi^2 = [L_{\text{scene}} - L_{\text{mod}}(\theta)]^T \cdot C^{-1} \cdot [L_{\text{scene}} - L_{\text{mod}}(\theta)]$$

$$L_{\text{scene}} = \epsilon_{BB} \times L_{BB} + (1 - \epsilon_{BB}) \times L_{AMB}$$

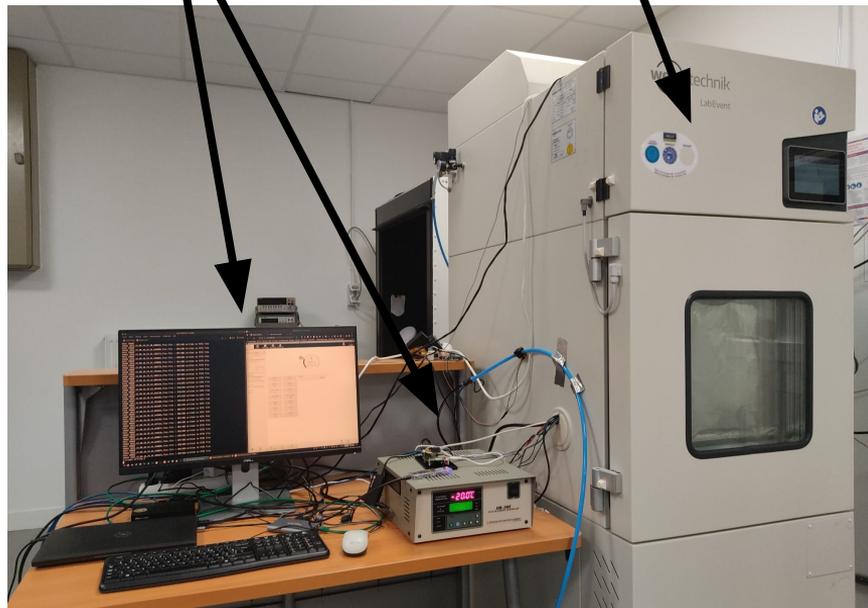
$$L_{\text{mod}} \equiv f(\theta, S, T_{FPA})$$

1 set of fitted parameters  $\theta$  per pixel  $\Rightarrow$  327,680 regressions

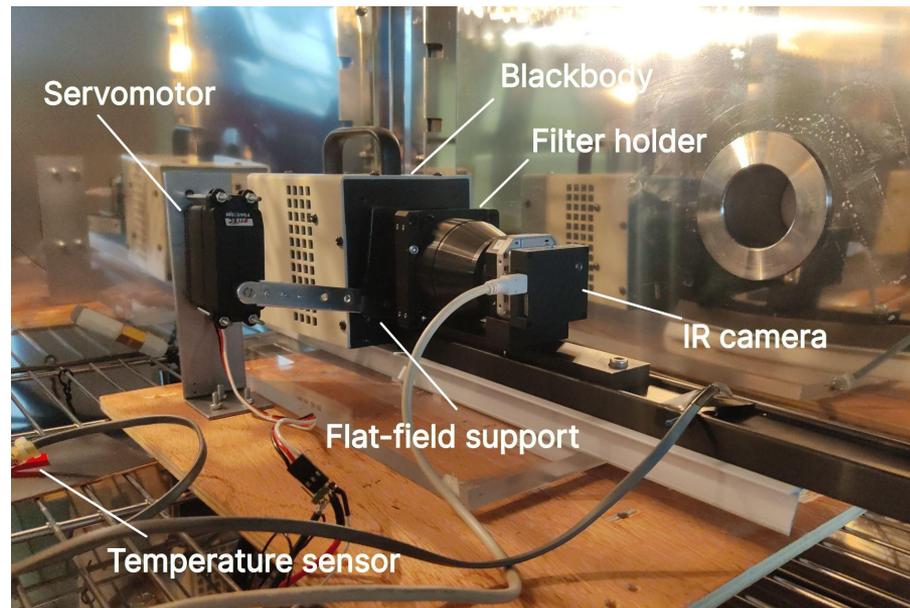
## 3.3 Experiments @ IJC-Lab

With Sylvie Dagoret-Campagne and Marc Moniez  
in December 2022

Control-command setup  
Climatic chamber  
for ATLAS ITK  
experiment



+300k images for multiple camera and  
low blackbody temperature setpoints

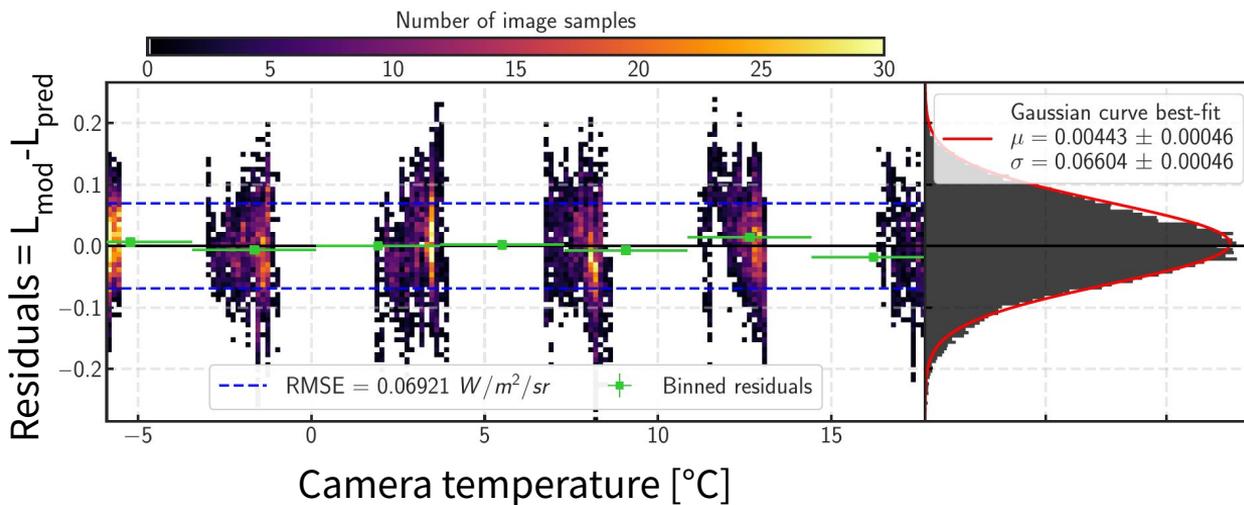


# 3.4 Preliminary results

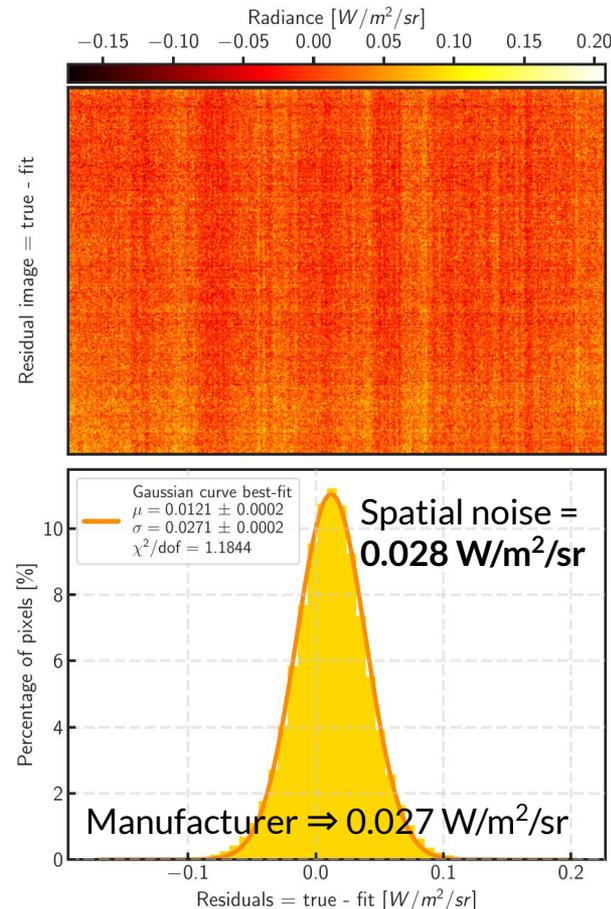
Pixel temporal noise =  $\pm 0.067$  (stat.)  $\pm 0.042$  (syst.)

$\Rightarrow \pm 0.080$  (total)  $W/m^2/sr$

\* Best calibration found in the literature :  $\pm 0.36 W/m^2/sr$   
(Nugent, 2008, PhD)

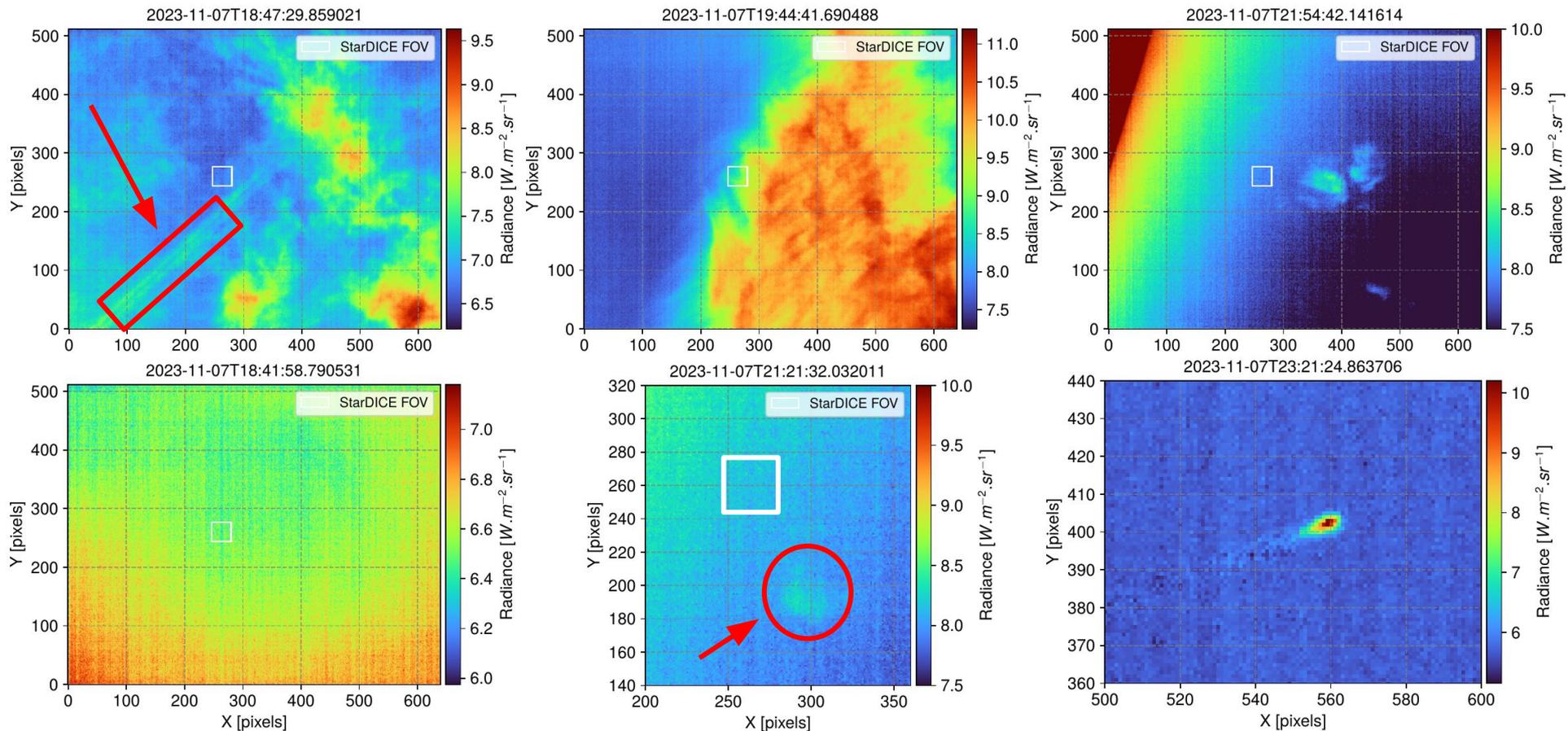


Caveat : extrapolation outside the calibration range (below  $-30^{\circ}C$ )



# 4. Overview of first observations

# 4.1 Quick look : a lot of things happen in 4h of imaging...



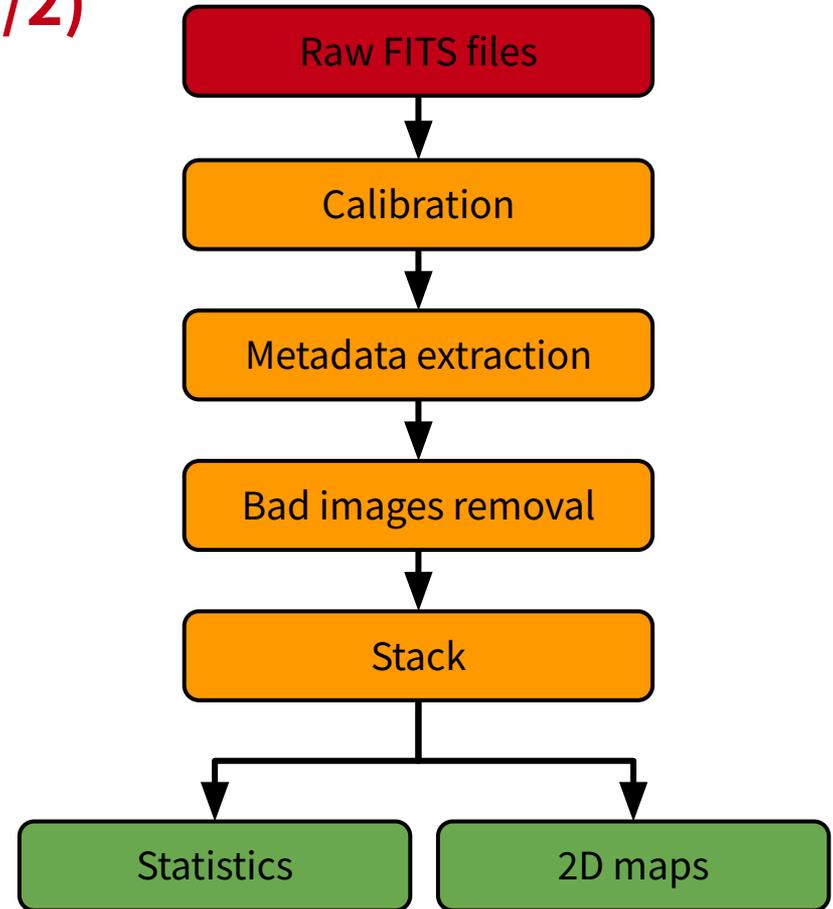
## 4.2 Night movie animation



<https://drive.google.com/file/d/1ddrEleWxekYS38OtJoGE9FtJotc97m1M/view?usp=sharing>

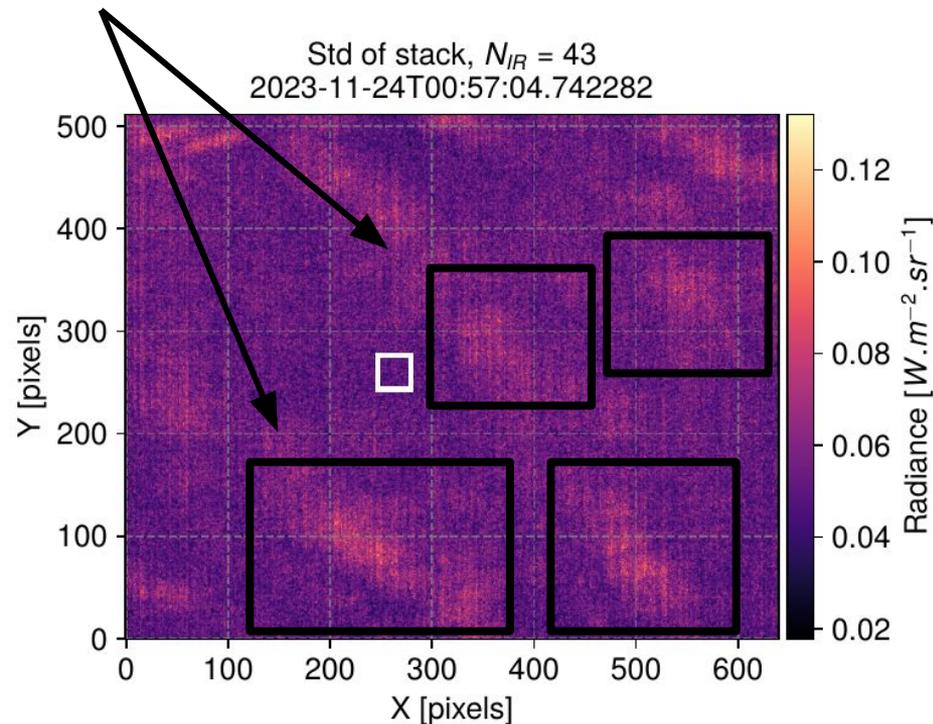
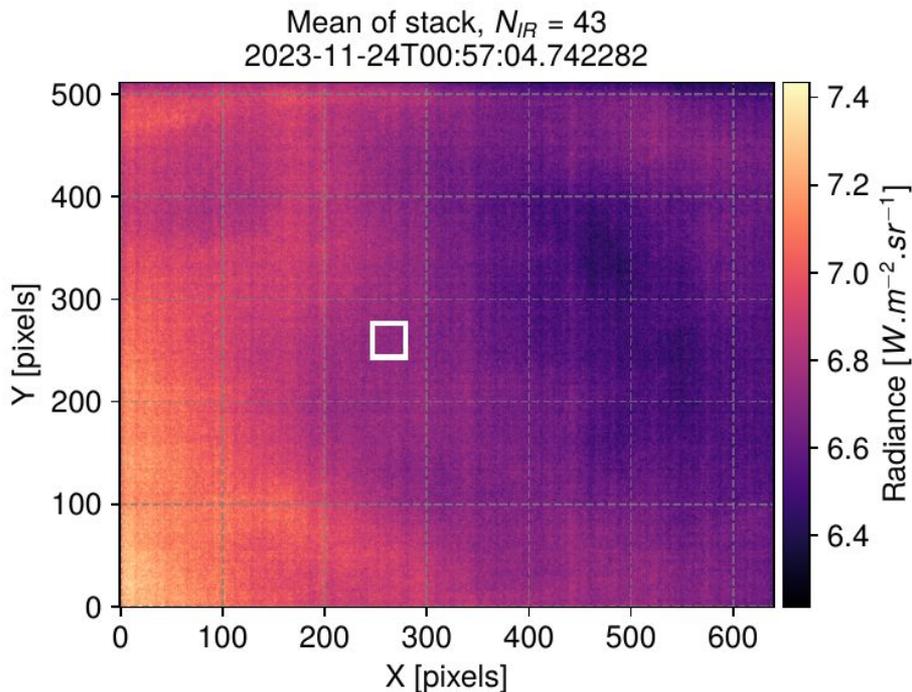
## 4.3 Pre-processing for DR0 (1/2)

- For each *ugrizG* exposure  
⇒  **$N_{\text{obs}}$  infrared images**
- Difficult to process all the individual images for analysis
- Statistics : spatial & temporal mean + std of the complete image and the StarDICE FOV
- For now :
  - ~ 80 GB to process per night
  - ~ 1 hours of processing per night on 40-cores server



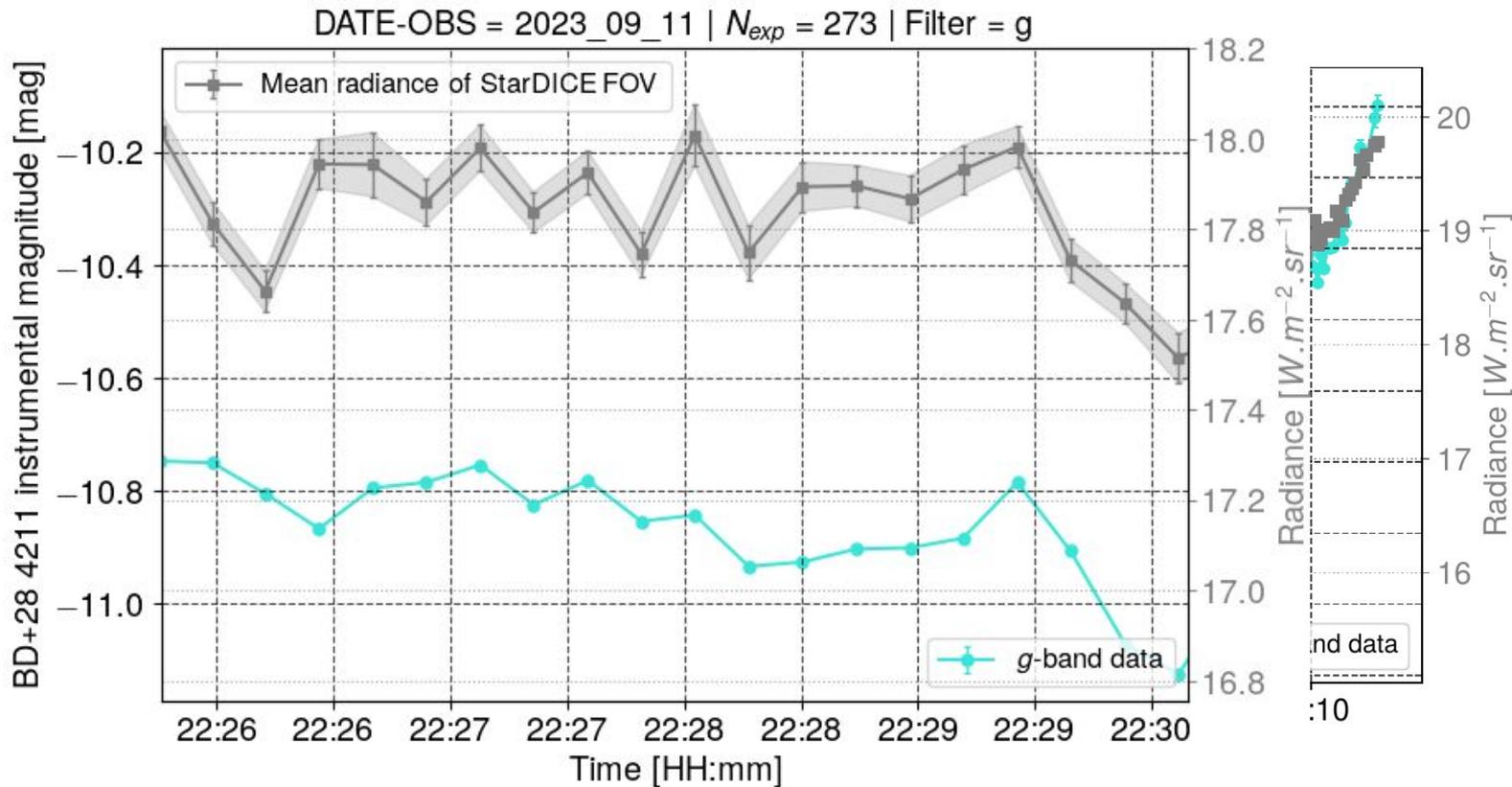
## 4.3 Pre-processing for DR0 (2/2)

→ Image / cloud structure evolution with time is key



## 4.4 Preliminary analysis on BD+28 4111 for one night (1/2)

- ~ 1 h from variable concentration first
- Only high image second



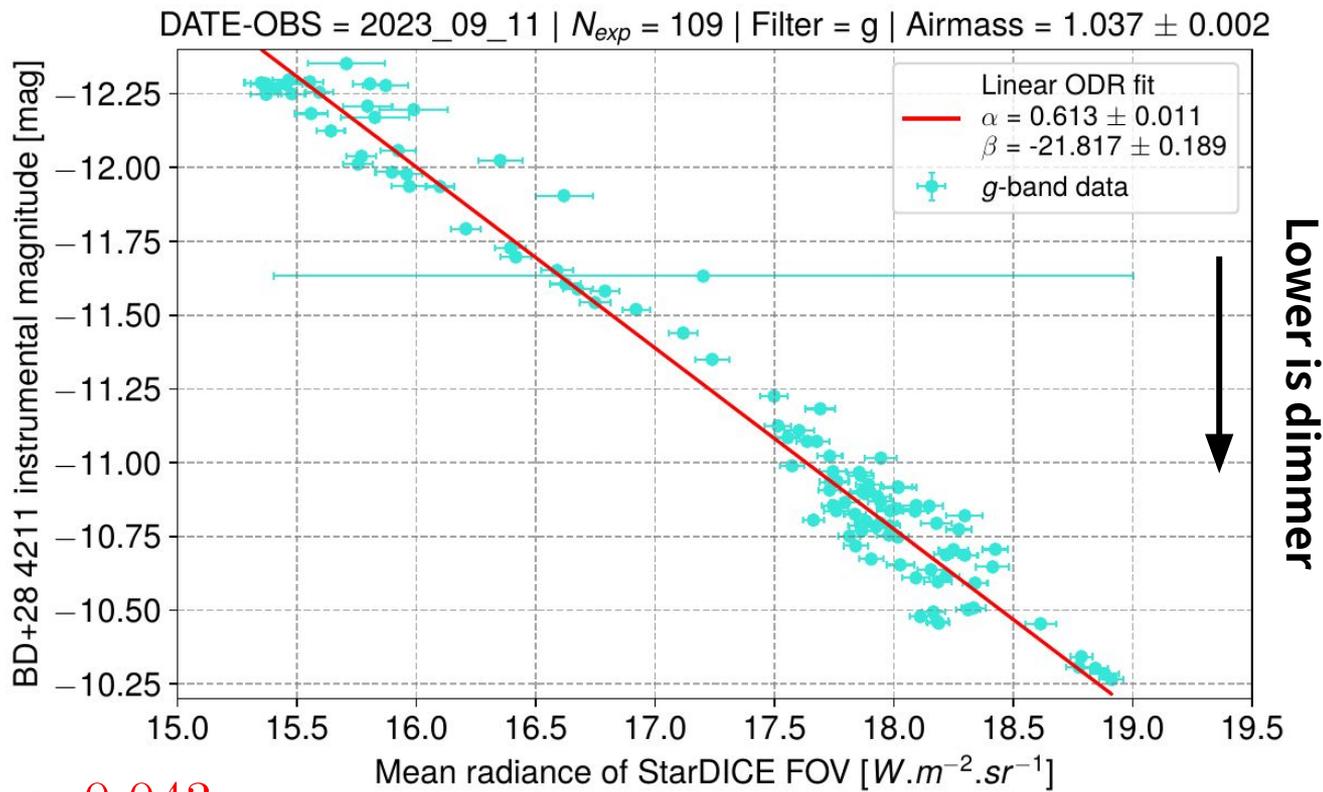
## 4.4 Preliminary analysis on BD+28 4111 for one night (2/2)

- Strong correlation between magnitude and radiance
- Linear dependence as a first approximation :

$$m_i = \alpha \times L_{i,*} + \beta$$

- With current uncertainty estimation (stat.+syst.) per pixel from calibration :

$$\sigma(m_i) = \alpha \times \sigma(L_{i,*}) \approx 0.043 \text{ mag}$$



## ● Next steps

- **Software :**
  - Complete the final stages of automating the pre-processing pipeline.
  - Anticipate an increase of data flux.
  - Correct for some issues regarding the control-command of the dome position affecting IR images + post-processing
- **Calibration :**
  - Finalize the calibration data analysis → publication
- **Analysis :**
  - Thorough IR and photometry analysis → robust metric for gray extinction.
  - Comparisons with libradtran simulations.
  - Combination of IR and UV-VIS-NIR data for atmosphere fitting.
  - Collaborate with OHP for atmosphere data leveraging lidar, AERONET, and more.

# Backup

## ● Summary

- Datasets from StarDICE pre-survey first nights look promising
  - Already +940k images ~ 750 GB
  - ~ 10 nights
- Remote observations of IR instrument @ OHP
- Excellent SNR → low spatial and temporal noise on calibrated images
- Linear dependence between star flux magnitude and IR radiance is confirmed