

# Precipitation and ice retrievals from PAZ Polarimetric Radio Occultations

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# Motivation

Since its activation in May 2018 PAZ has collected 249,783 polarimetric RO

Soon after activation we demonstrated the sensitivity to heavy precipitation

Recently, we have demonstrated that PRO is also sensitive to horizontally oriented frozen particles, way above the freezing level

## Geophysical Research Letters

### RESEARCH LETTER

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#### Key Points:

- We present the first spaceborne GNSS radio occultation signals acquired at two polarizations
- The measured observables sense intense precipitation and capture its vertical structure
- No other technique captures both thermodynamics and hydrometeor profiling in intense rain phenomena

### Sensing Heavy Precipitation With GNSS Polarimetric Radio Occultations

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## Sensing Horizontally Oriented Frozen Particles with Polarimetric Radio Occultations aboard PAZ: Validation Using GMI Coincident Observations and Cloudsat a-Priori Information

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# Motivation

## Examples:

Coincident observation with **GPM radar** (Ka & Ku band, 15-35 GHz)

**Simulations using liquid phase precipitation cannot explain PAZ  $\Delta\phi$**

Radiometer GMI 166 GHz  $T_b$  indicates presence of frozen particles, and PD ( $T_bV-T_bH$ ) indicates orientation

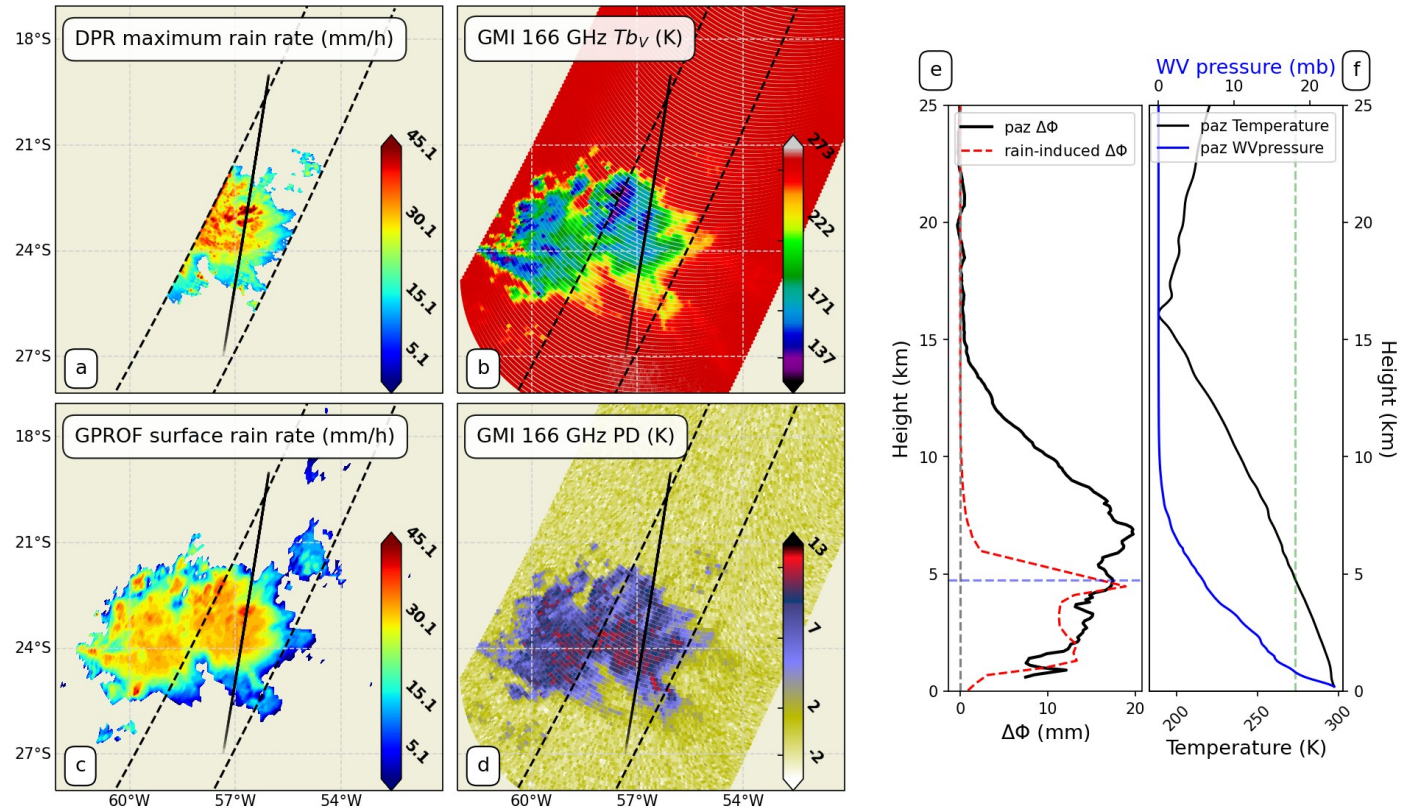


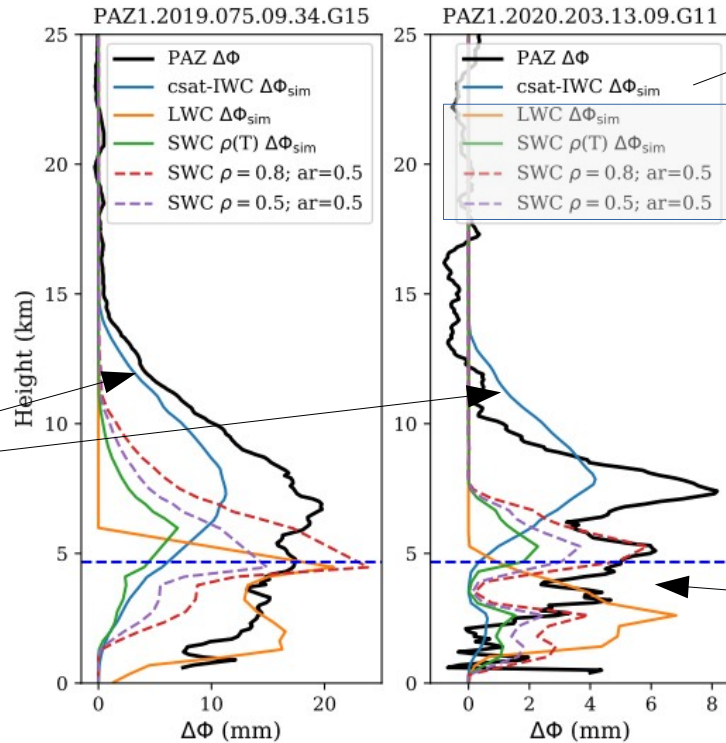
Figure from Padullés et al, 2021, IEEE TGRS (accepted) doi: 10.1109/TGRS.2021.3065119

# Motivation

## Examples:

We need retrievals from **Cloudsat** (radar 94 GHz) to explain PAZ  $\Delta\phi$ .

Better match with observations using Cloudsat retrievals in the higher layers  
*(room for improvement changing parameters)*



Cloudsat retrievals  
GPM retrievals

GPM retrievals explain the lower layers

Figure from Padullés et al, 2021, IEEE TGRS (accepted) doi: 10.1109/TGRS.2021.3065119

## Motivation

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**We know we are sensitive to ice, so  
Can we attempt ice retrievals in the higher  
layers?**

*(where there is little contamination from the  
liquid, and the ray-paths within clouds are not  
as long as in the lower layers)*

# PAZ $\Delta\phi$ Climatology

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## Climatology approach

- **Objective:** To look for a relationship between PAZ  $\Delta\phi$  and Ice Water Content, as a function of height and region
- **Challenge:** No direct collocations with Cloudsat (or any other radar sensitive to ice particles). How to build an empirical relationship? How to validate it?
- **Approach:** Empirical relationship between PAZ  $\Delta\phi$  climatology and Cloudsat Ice Water Content climatology

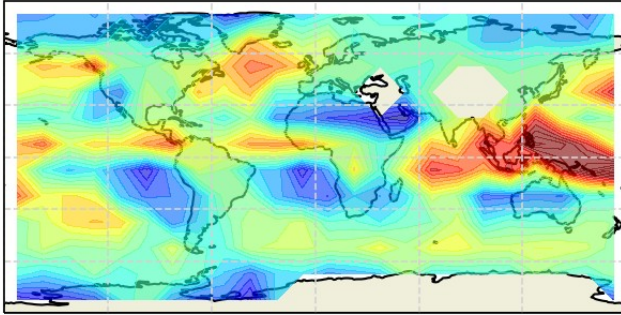


# PAZ $\Delta\phi$ Climatology

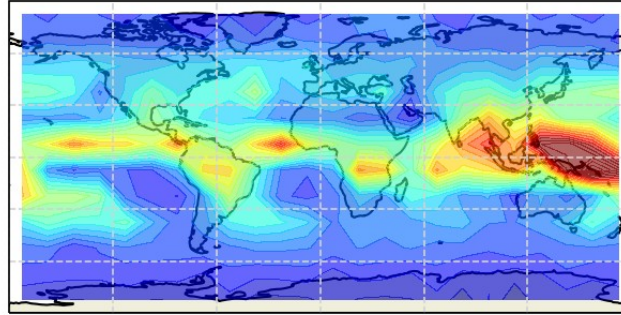
## Relationship between $\Delta\phi$ and water content

### PAZ $\Delta\phi$ Climatology

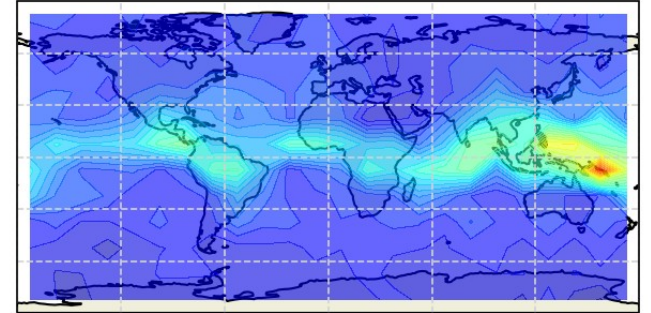
Tangent height = 2 km



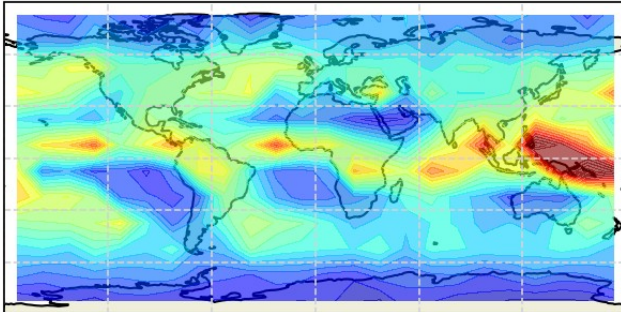
Tangent height = 6 km



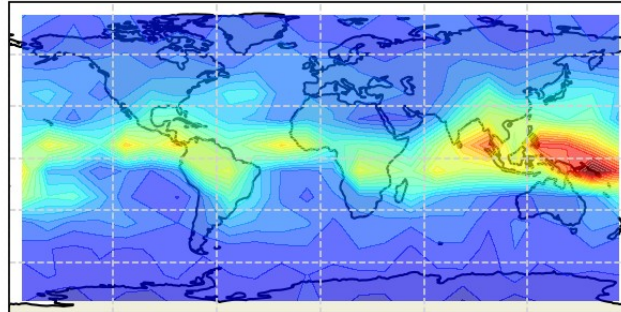
Tangent height = 10 km



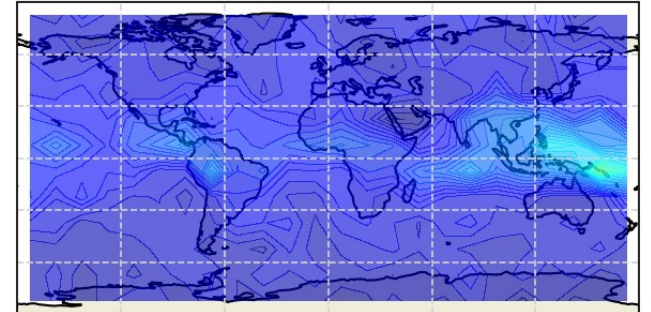
Tangent height = 4 km



Tangent height = 8 km



Tangent height = 12 km





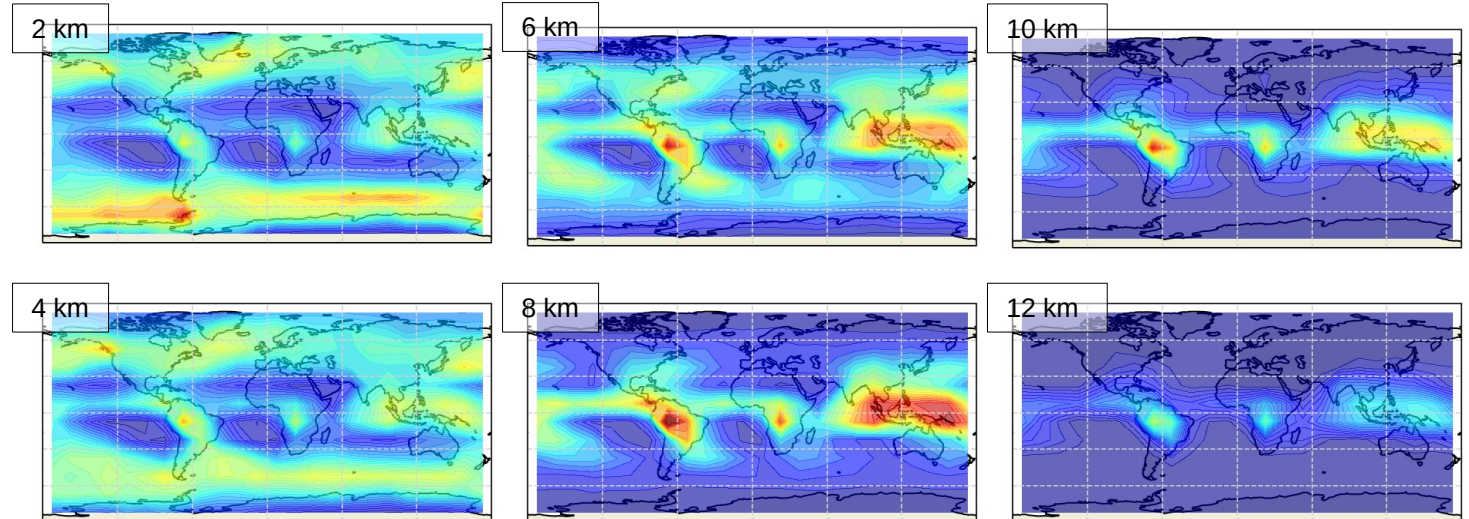
# PAZ $\Delta\phi$ Climatology

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We compare it with Cloudsat (radar):

- Taking into account the RO geometry
- 680,000 “events” (2009 – 2016)
- Integrated water content along RO ray

## Cloudsat WC Climatology



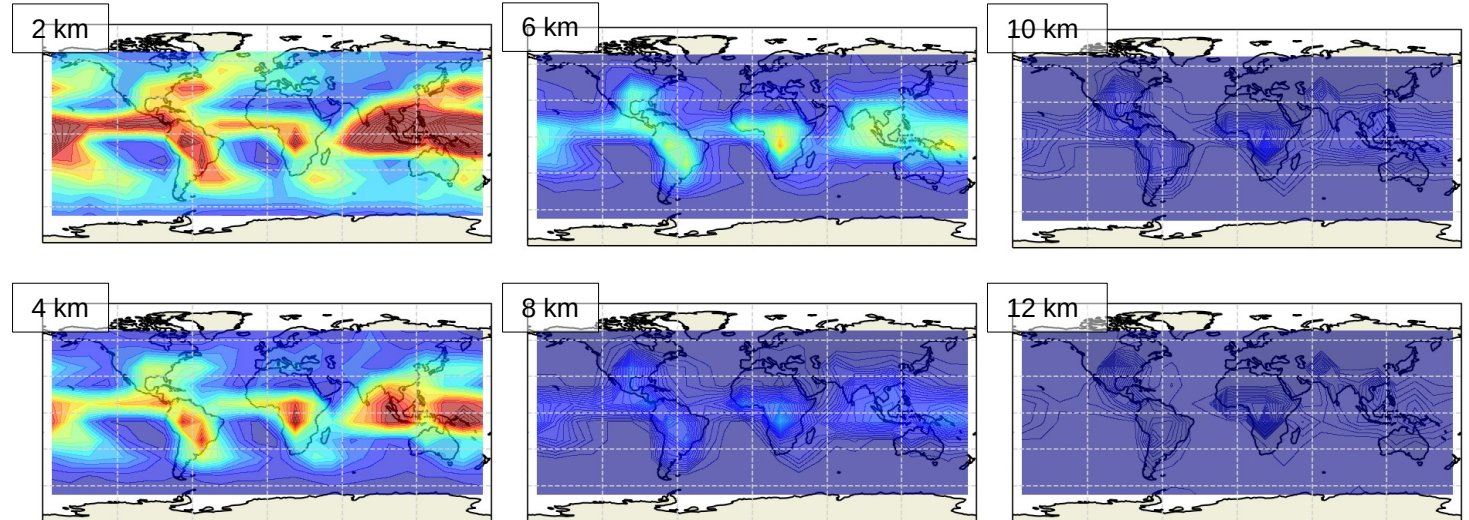
# PAZ $\Delta\phi$ Climatology

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We compare it with GPM – DPR (radar):

- Taking into account the RO geometry
- 350,000 “events” (2015 – 2017)
- Integrated water content along RO ray

## GPM WC Climatology

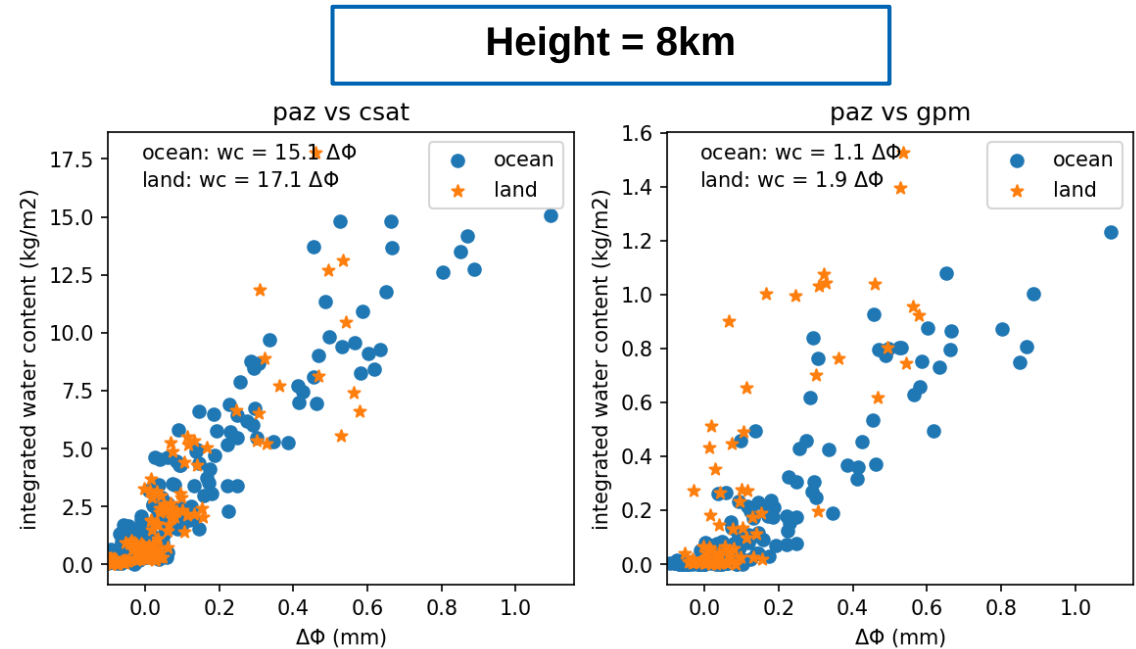
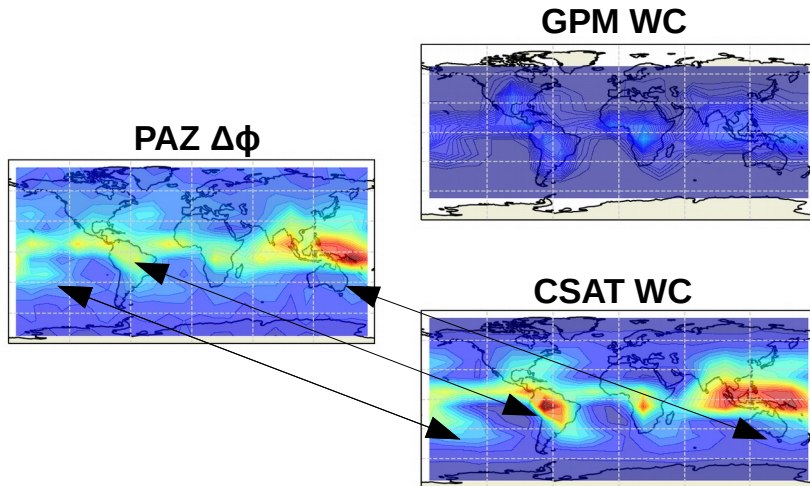


# PAZ $\Delta\phi$ Climatology

## Relationship between $\Delta\phi$ and water content

### Spatial correlation between $\Delta\phi$ and WC for the different satellites

Using the same binning, we compare the climatologies (at 8 km)

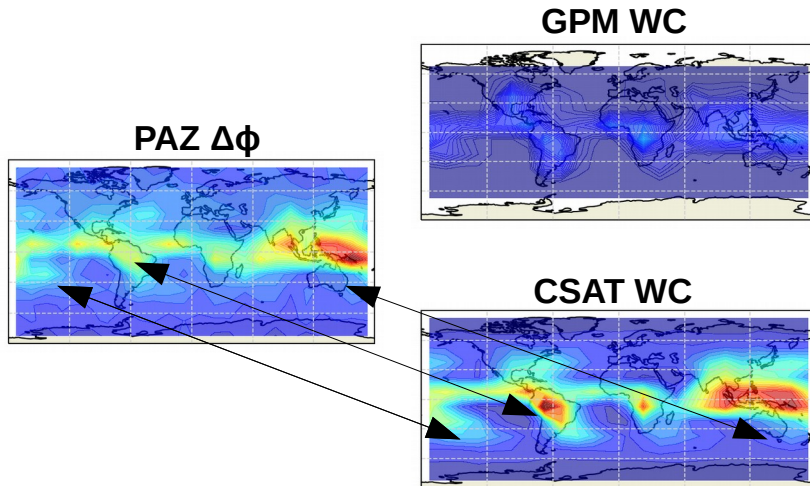


# PAZ $\Delta\phi$ Climatology

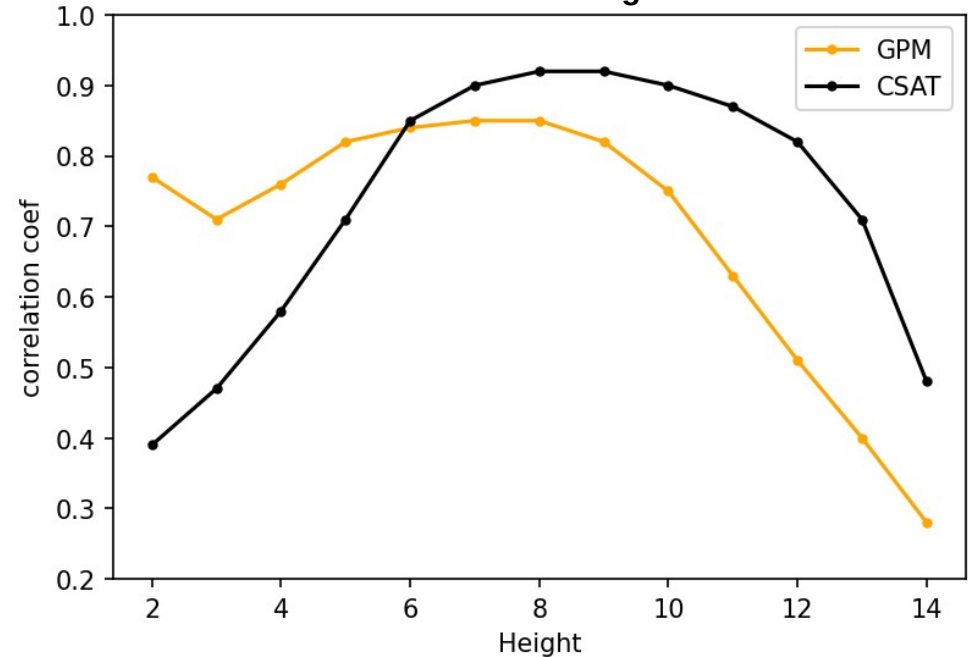
## Relationship between $\Delta\phi$ and water content

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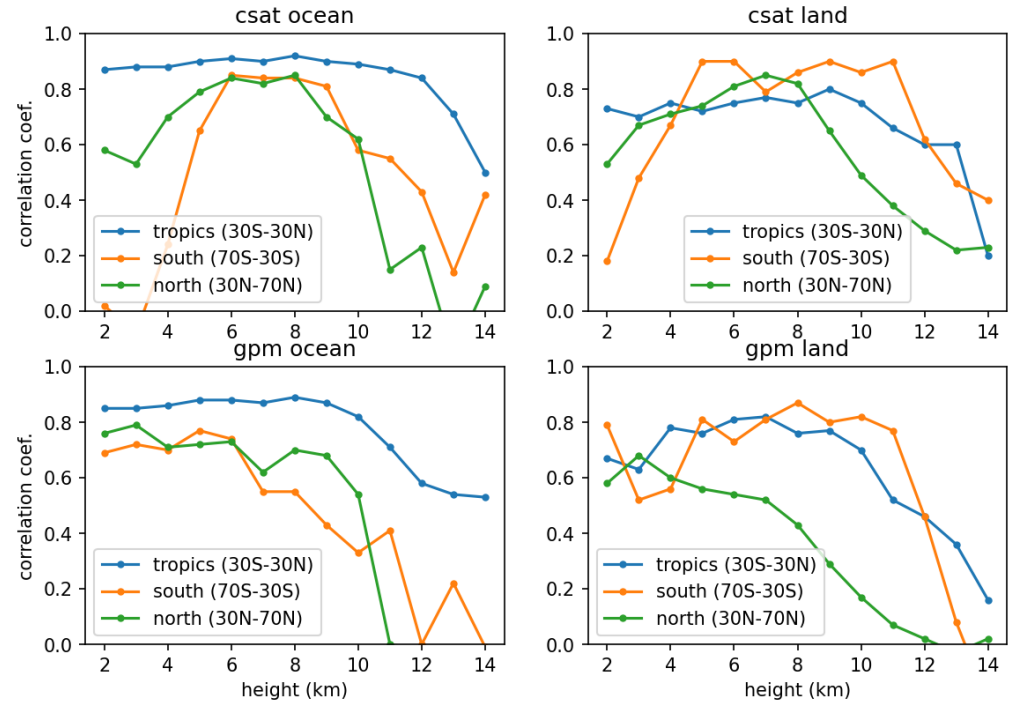
Correlation between  $\Delta\phi$  and water content as a function of height



# PAZ $\Delta\phi$ Climatology

- Very high correlation over tropical ocean
- Correlation with Cloudsat water content products is high up to **12 km**
- With GPM the correlation starts to decrease  **$h > 9\text{km}$**

Since the correlation is very high, it makes sense to **attempt a retrieval of IWC (at least, in the upper layers)**

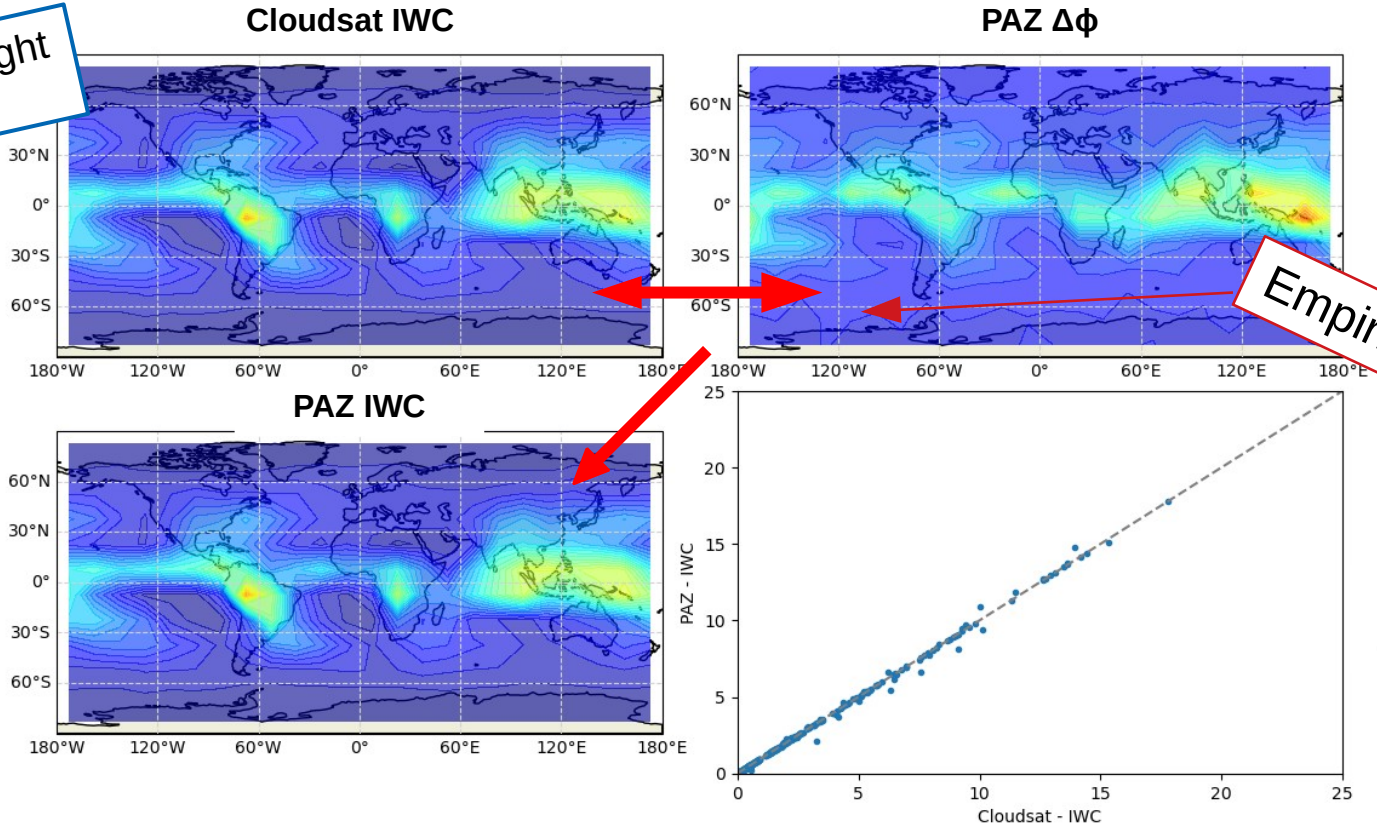




# Ice water content retrieval based on Climatology comparisons

$\Delta\phi$  vs integrated water content relationship, per region, per height

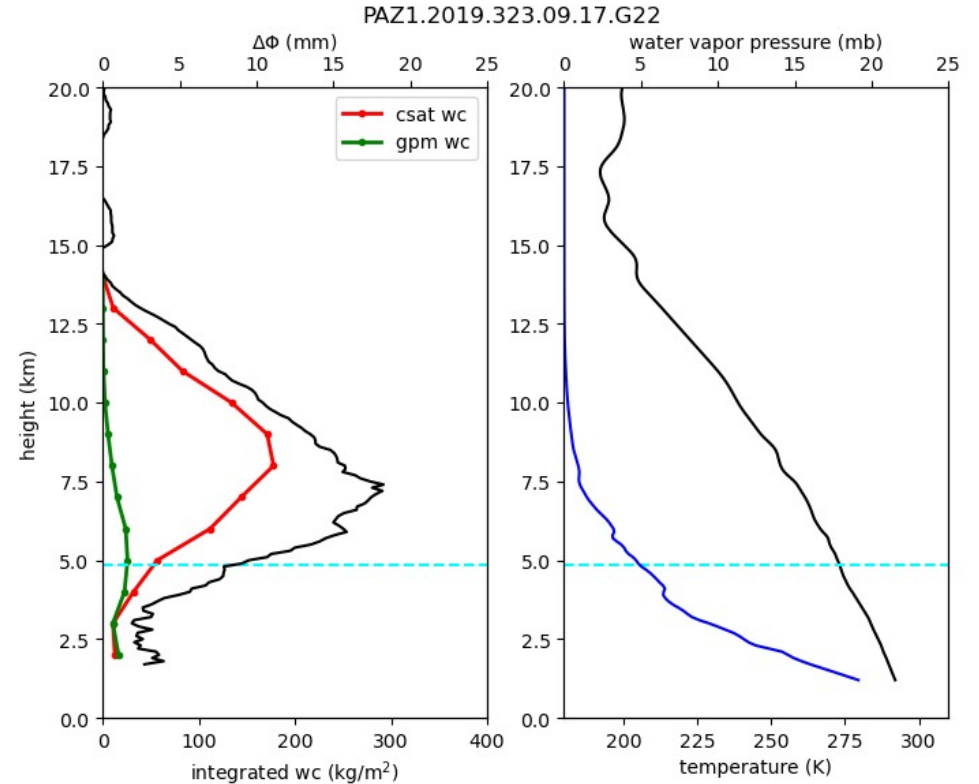
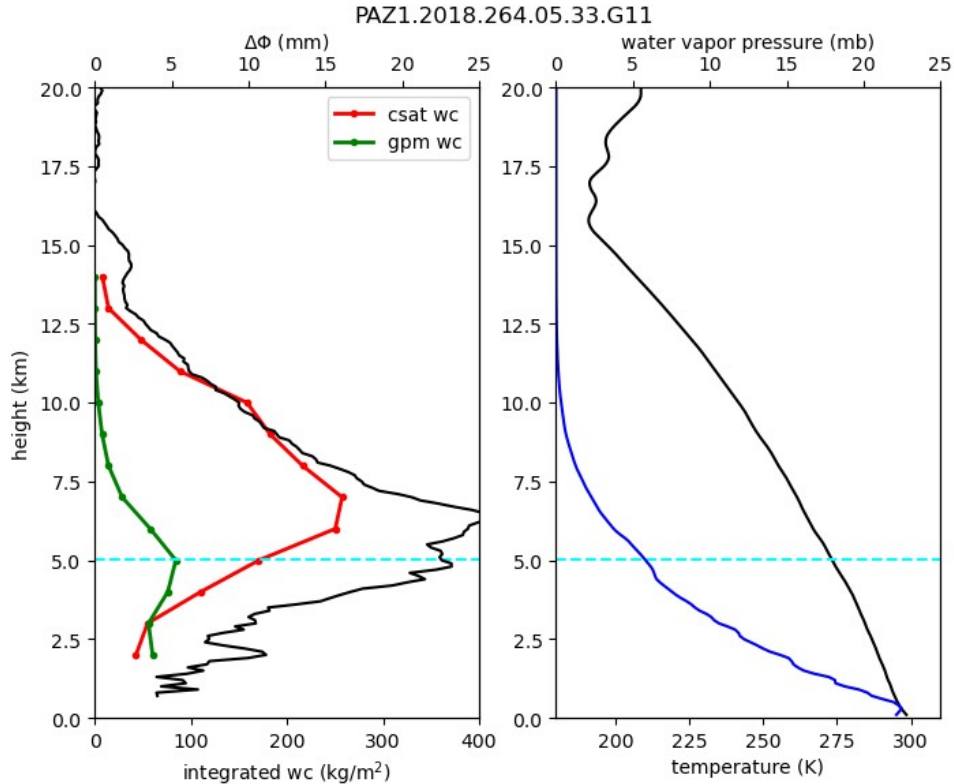
Example at a height of 9 km





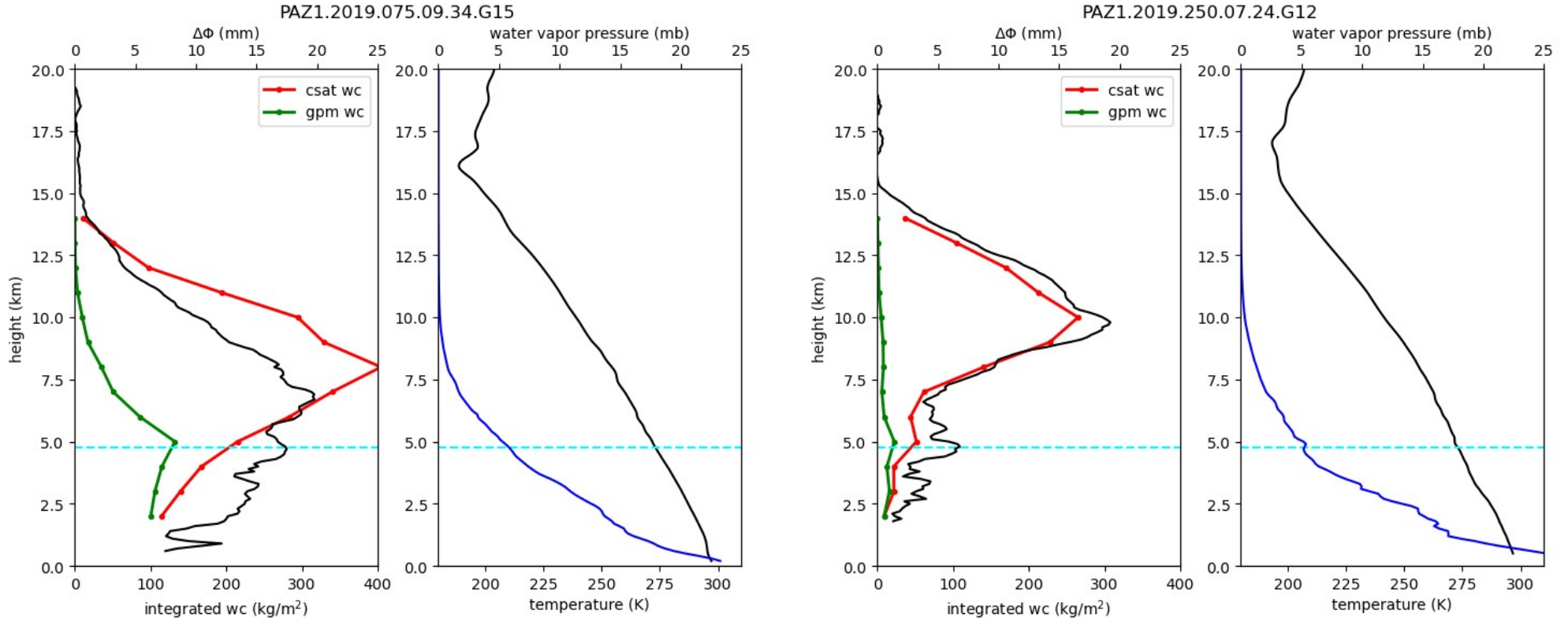
# Ice water content retrieval: application to individual cases

## Case examples



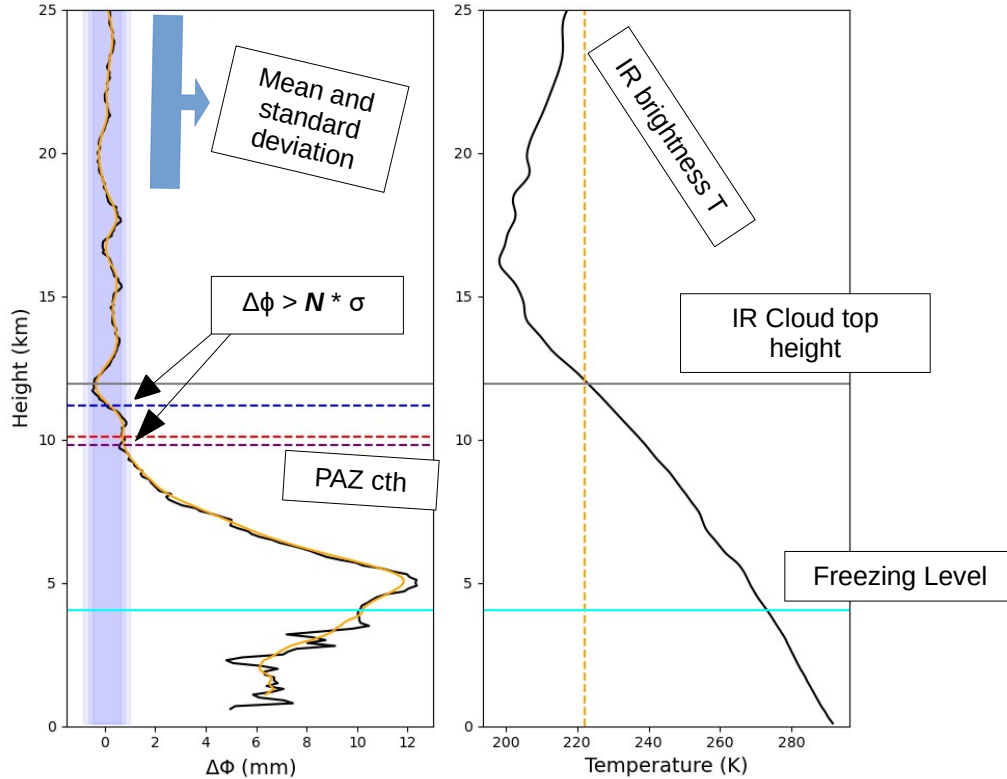
# Ice water content retrieval: application to individual cases

## Case examples



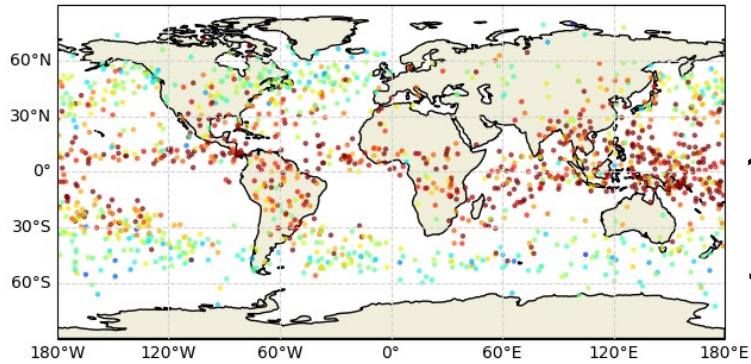
# Top of $\Delta\phi$ signal: Cloud Top Height

Algorithm to detect the  $\Delta\phi$  top of the signal: cloud top height

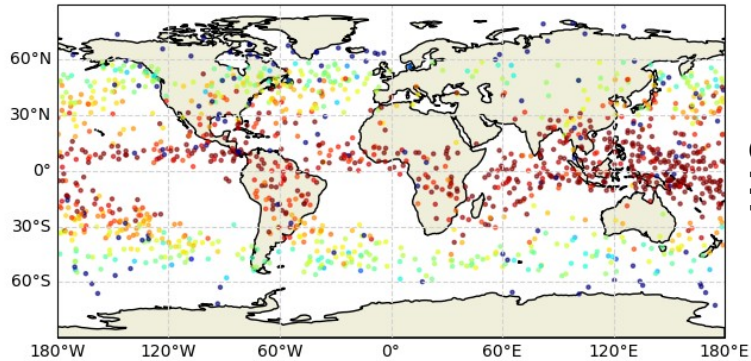


# Top of $\Delta\phi$ signal: Cloud Top Height

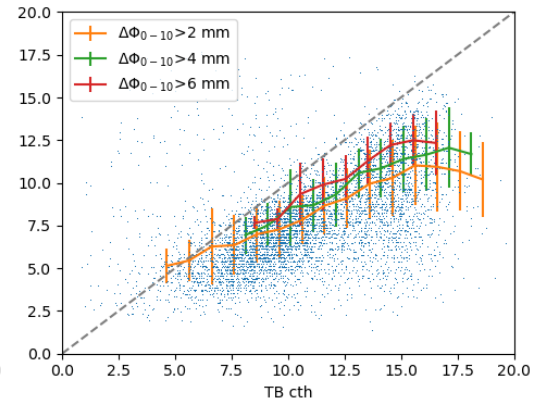
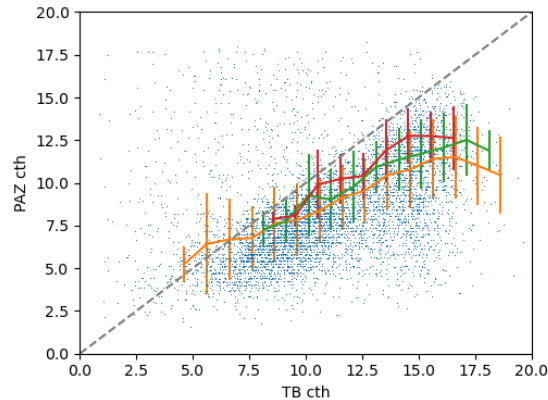
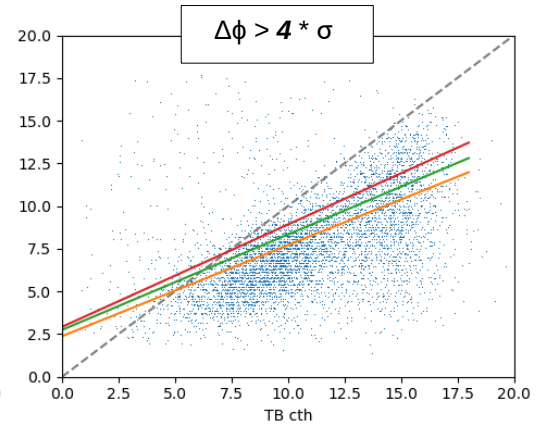
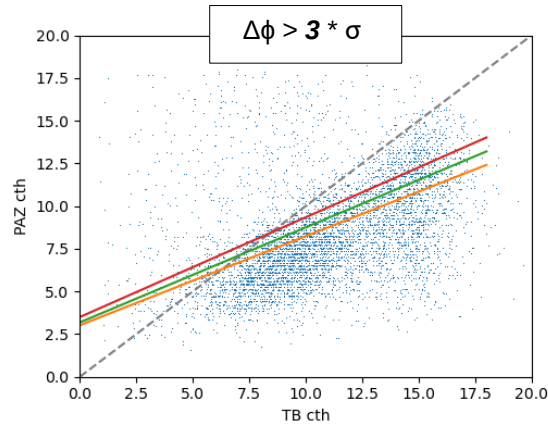
Algorithm to detect the  $\Delta\phi$  top of the signal: cloud top height



PAZ derived  
CTH (+3 km)



IR derived  
CTH



## Conclusions

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- PAZ  $\Delta\phi$  measurements are sensitive to frozen particles, in addition to heavy precipitation
- In the higher layers, it seems feasible to attempt an ice product retrieval
  - High correlation with Cloudsat climatology (specially over ocean and  $> 8$  km)
  - Validation remains a challenge
  - **Potential level 2 or 3 product**
- PAZ  $\Delta\phi$  provides an indication of the Cloud Top Height (**potential product as well**)
- **work in progress Towards a precipitation retrieval:** Propagate  $\Delta\phi$  induced by frozen particles down and correct the  $\Delta\phi$ : the remaining part is linked to liquid precipitation



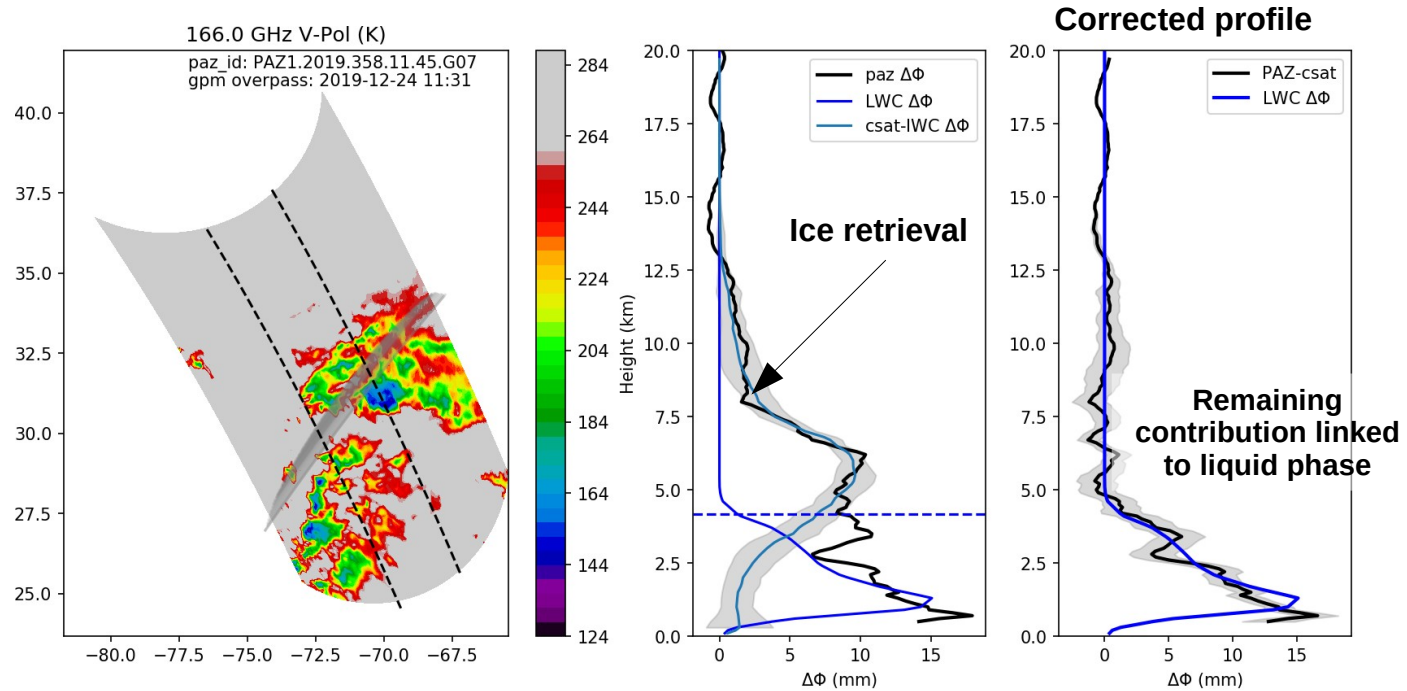
Data and more info available at: [paz.ice.csic.es](http://paz.ice.csic.es)

# Precipitation retrieval

Propagate down and correct the  $\Delta\phi$  induced by frozen particles

## Work in progress

- Single example to show the concept



Inversion could be attempted using Look Up Tables built in *Cardellach et al. 2018*, doi: 10.1002/qj.3161



**Thank you!**



Data and more info available at:

**[paz.ice.csic.es](http://paz.ice.csic.es)**