

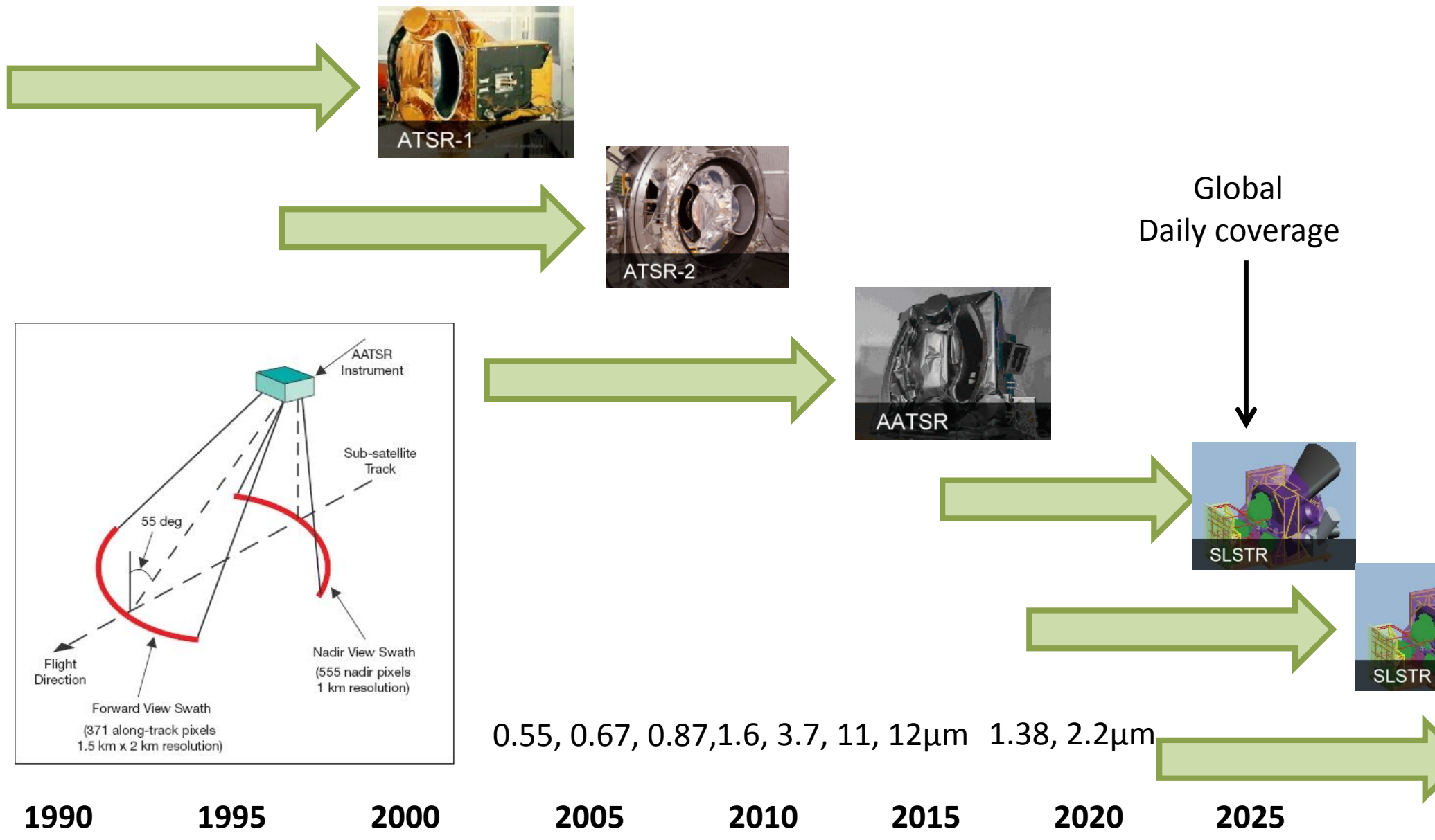
# AATSR Cloud retrieval and validation

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RAL and University of Oxford  
and thanks also to CCI team.

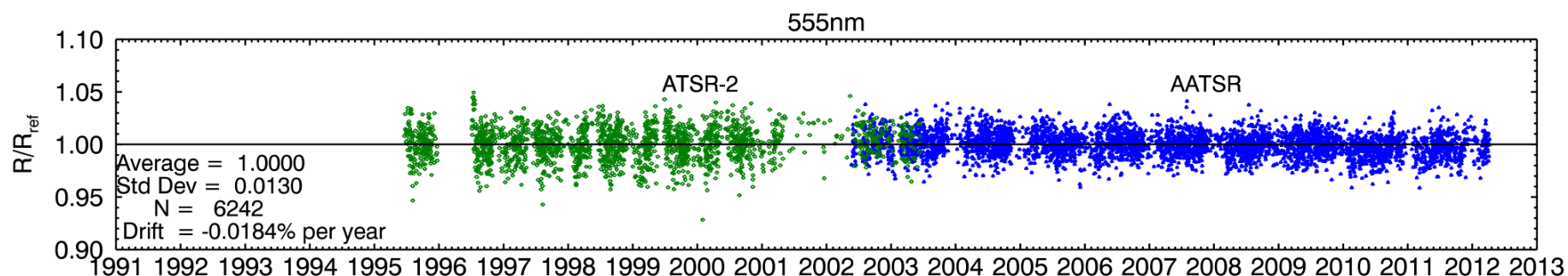
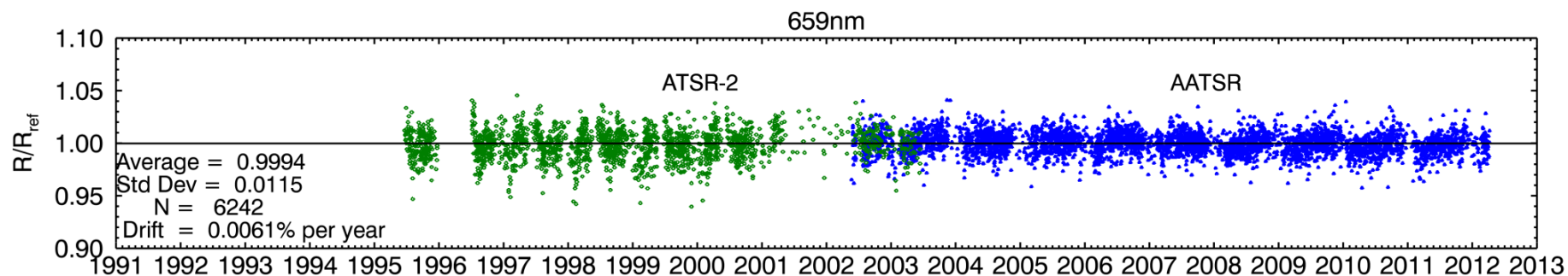
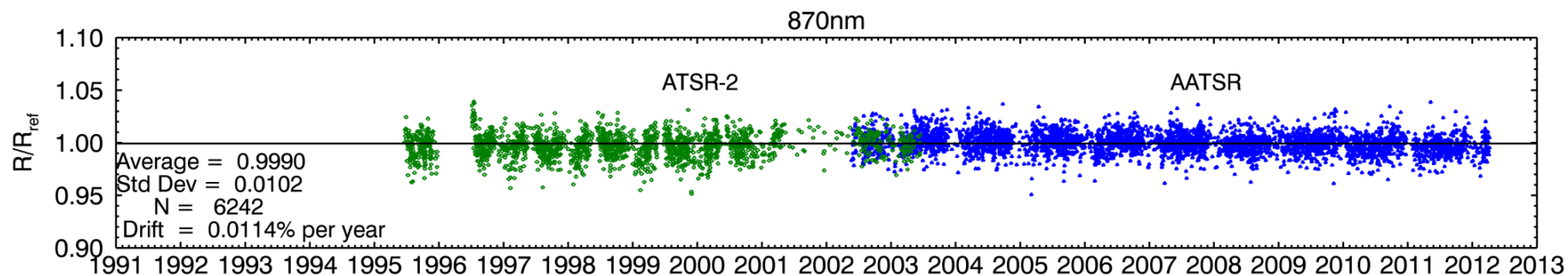
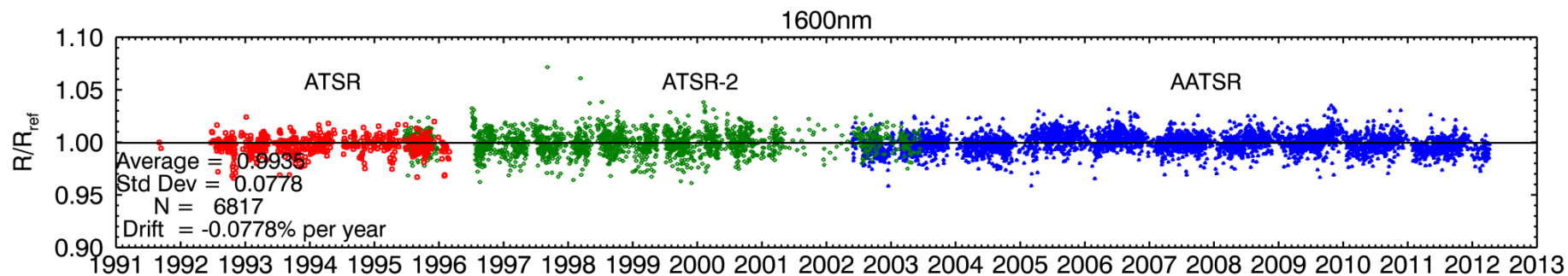


# Outline

- AATSR instrument
- Algorithm
- Validation of properties and uncertainty
- Aerosol/cloud consistency
- Future



# Time series of Along Track Scanning Radiometer Instruments

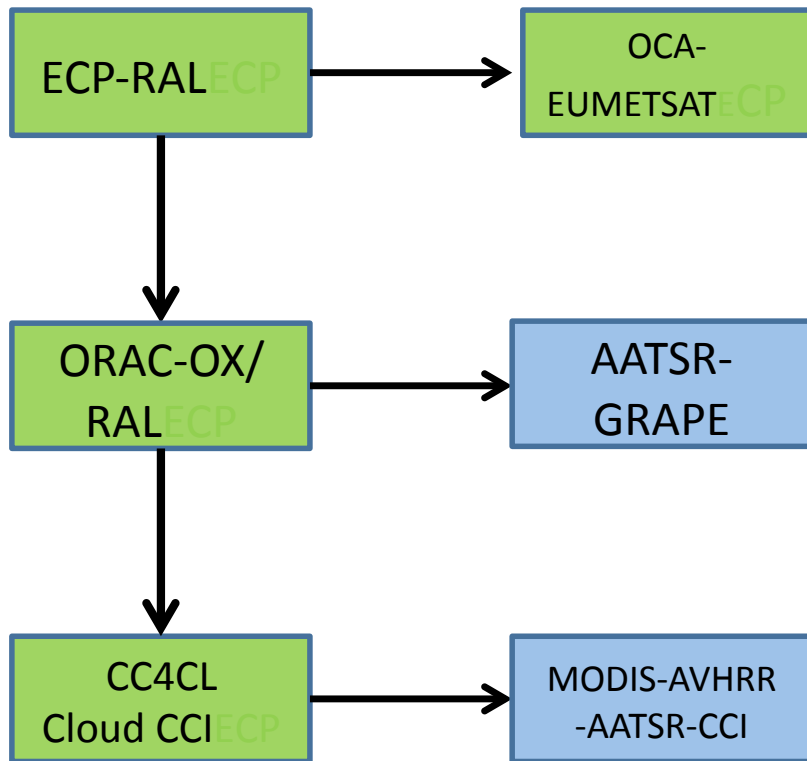


ATSR stability, slides courtesy Dave Smith

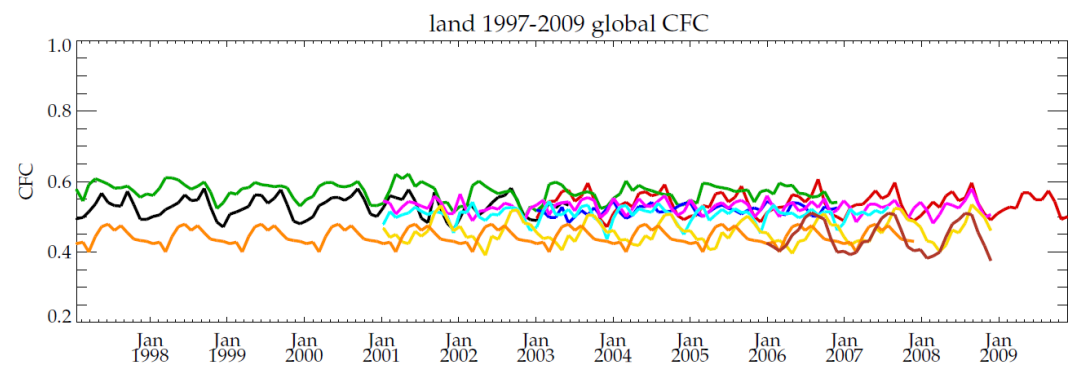
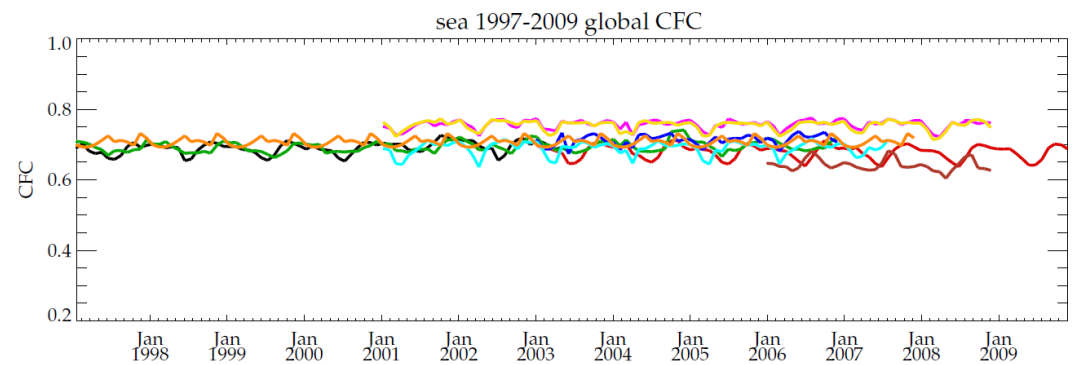
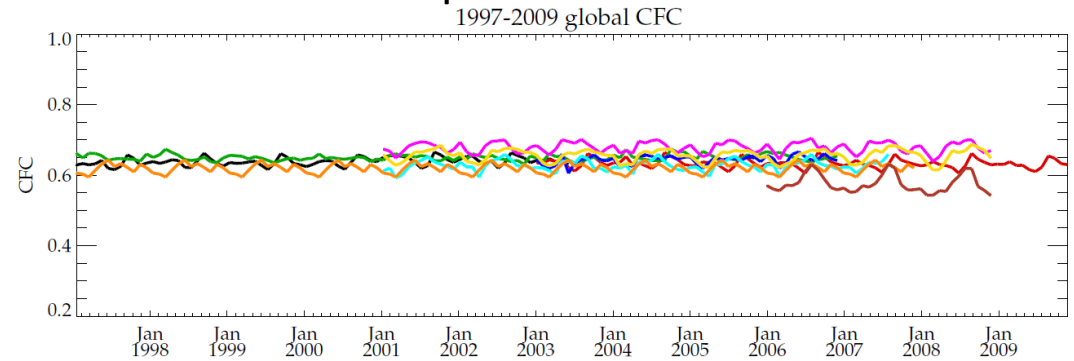
# Climate friendly retrieval

- *Stable calibration, over a long time period*
- *Comprehensive uncertainty characterisation*
- *All surface-atmosphere properties determined from a satellite instrument are consistent with the TOA radiance field*
  - The retrieval of surface and atmospheric properties is such that TOA radiances simulated using the retrieved atmospheric and surface properties should not differ from the measured radiances.
  - The global TOA radiation field is generated from a mixture of clear and cloudy skies.
    - Aerosol and Cloud retrieved using similar algorithm
    - Aerosol and Cloud use a consistent cloud identification

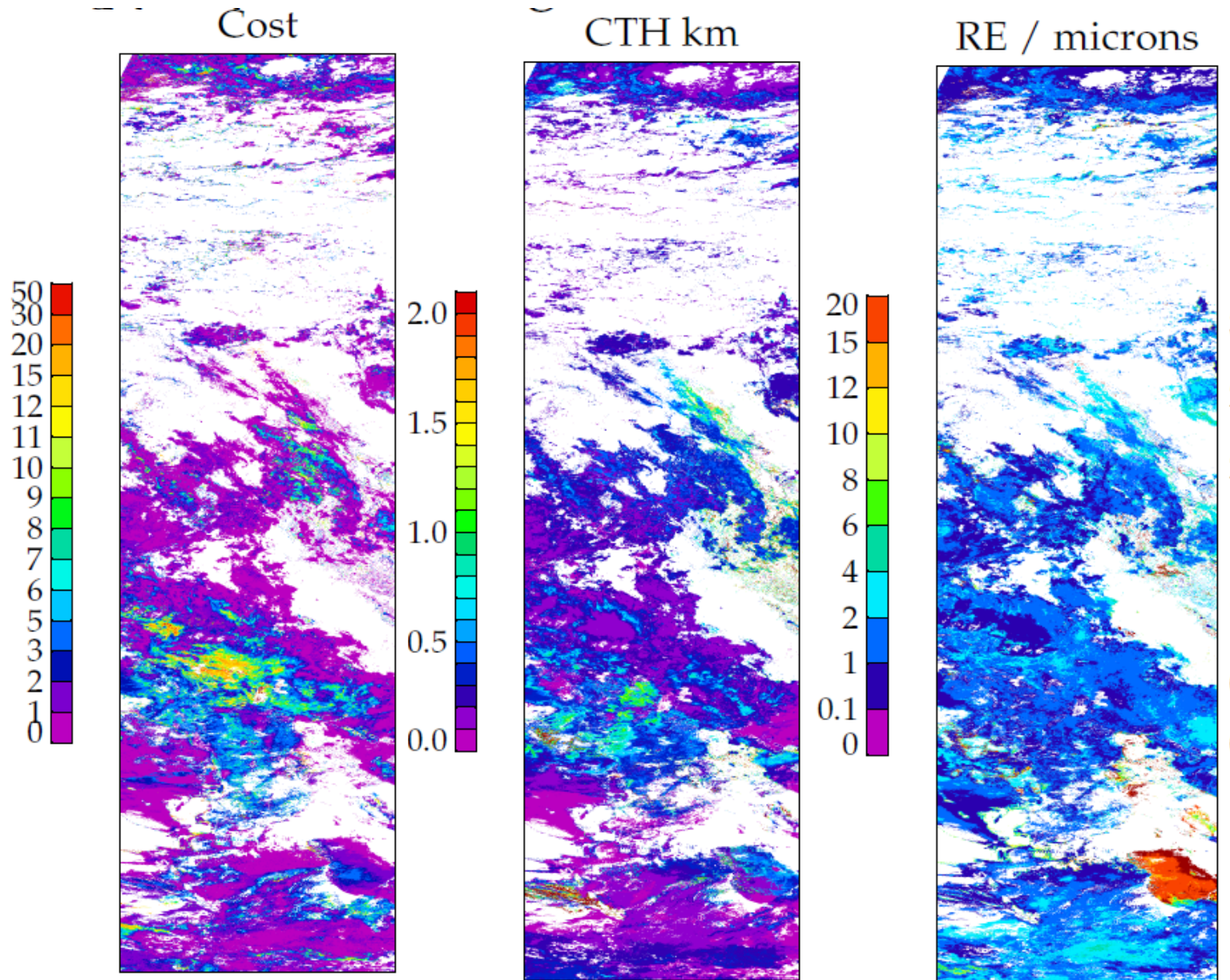
# History of cloud Algorithm



## GEWEX comparison of Cloud fraction

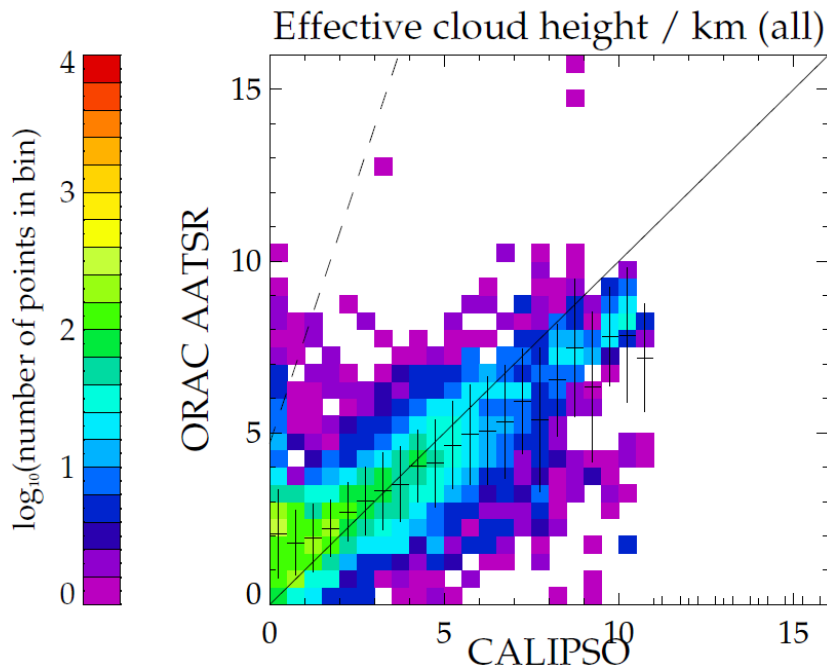
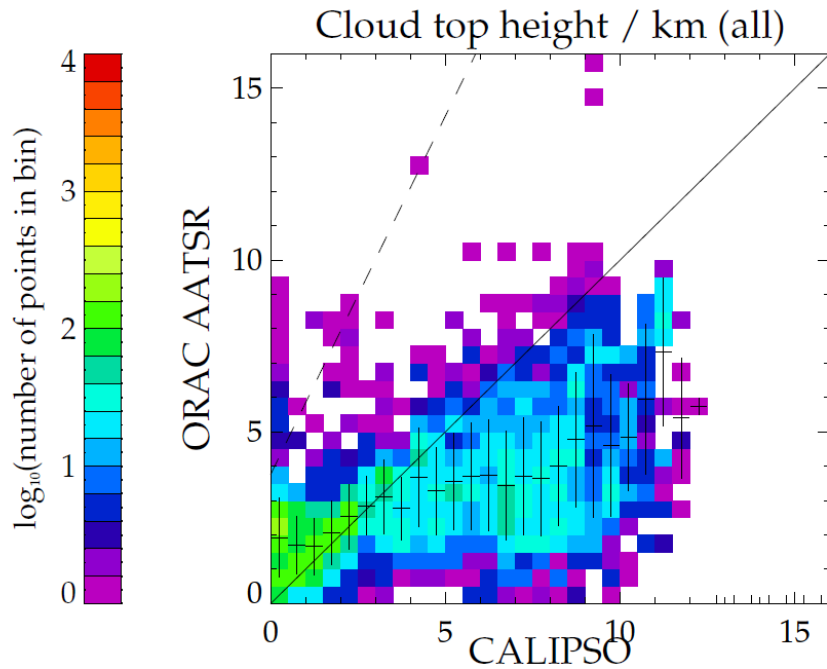


# Retrieval of cloud properties

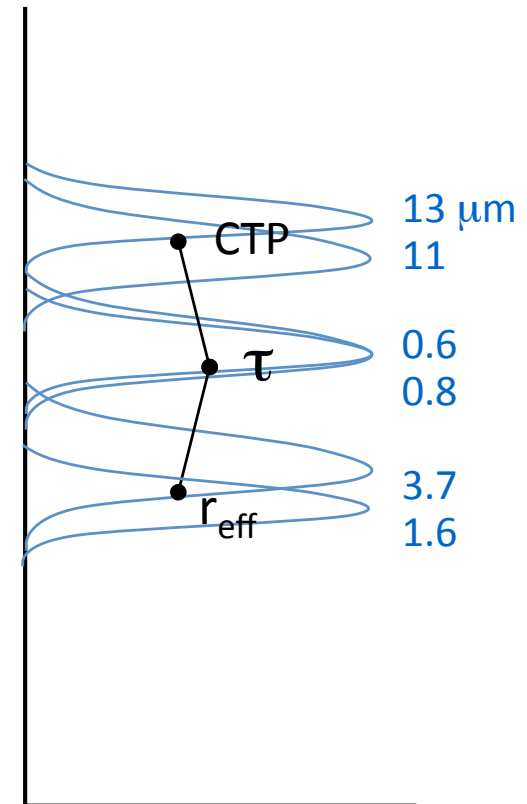


Pixel level uncertainty of cloud parameters from propagated forward model and measurement uncertainty

3  
2  
2  
1  
1  
0  
0



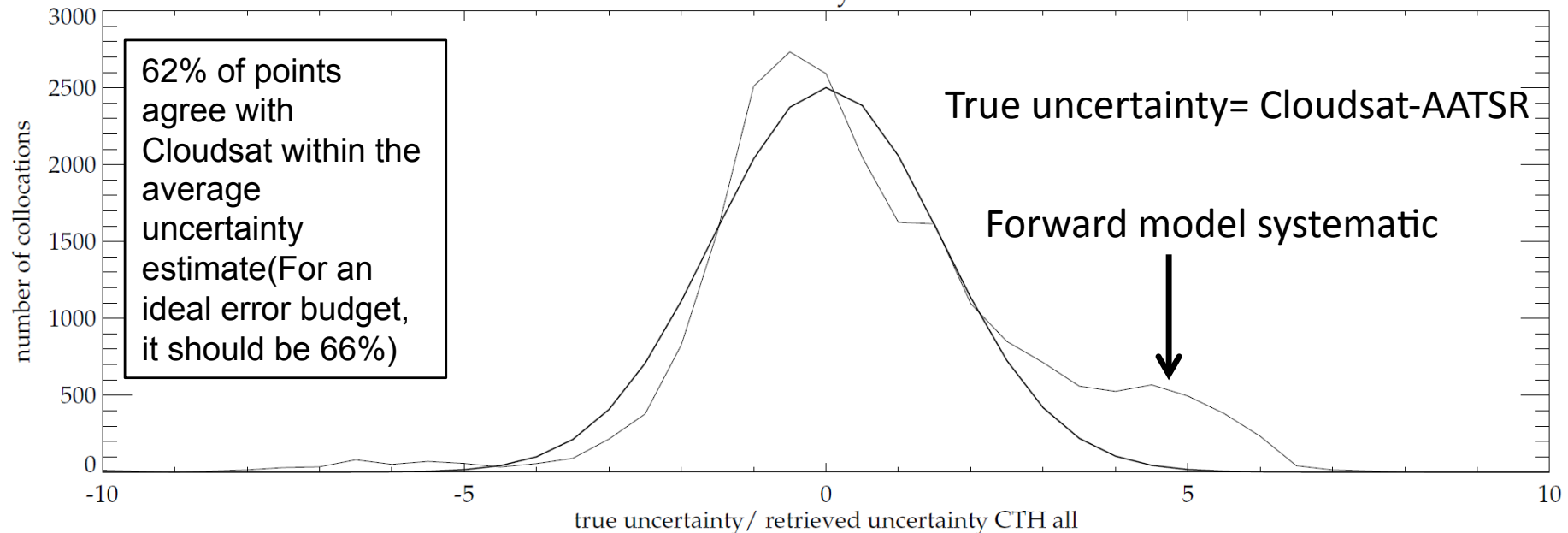
- Effective CTH accounts for vertical penetration of the IR clouds by using Calipso and Cloudsat optical depth to estimate the height (approx 1 optical depth) into the cloud.





# Validation of uncertainty

CTH Uncertainty validationall



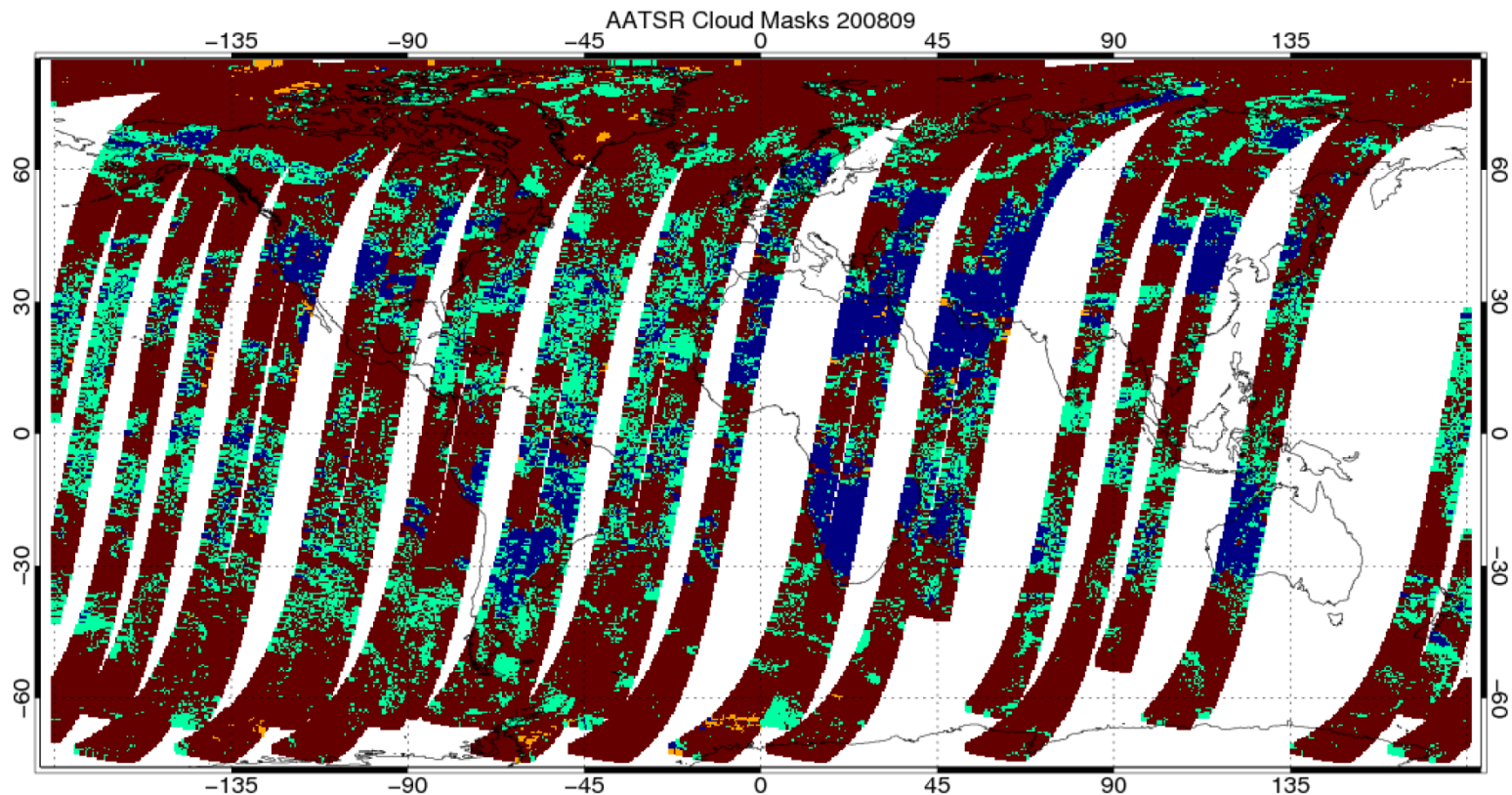
OE uncertainty is random

Currently: measurement, coregistration and homogeneity and surface uncertainty is propagated through the retrieval

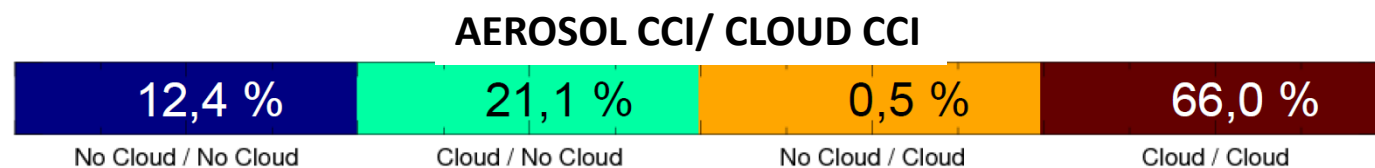
Cost indicates good fit to the model- often identifies ML cloud

- $\gg 1$  OE uncertainty too low
- $\ll 1$  OE Uncertainty too high

# Comparison of aerosol CCI and cloud CCI cloud masks



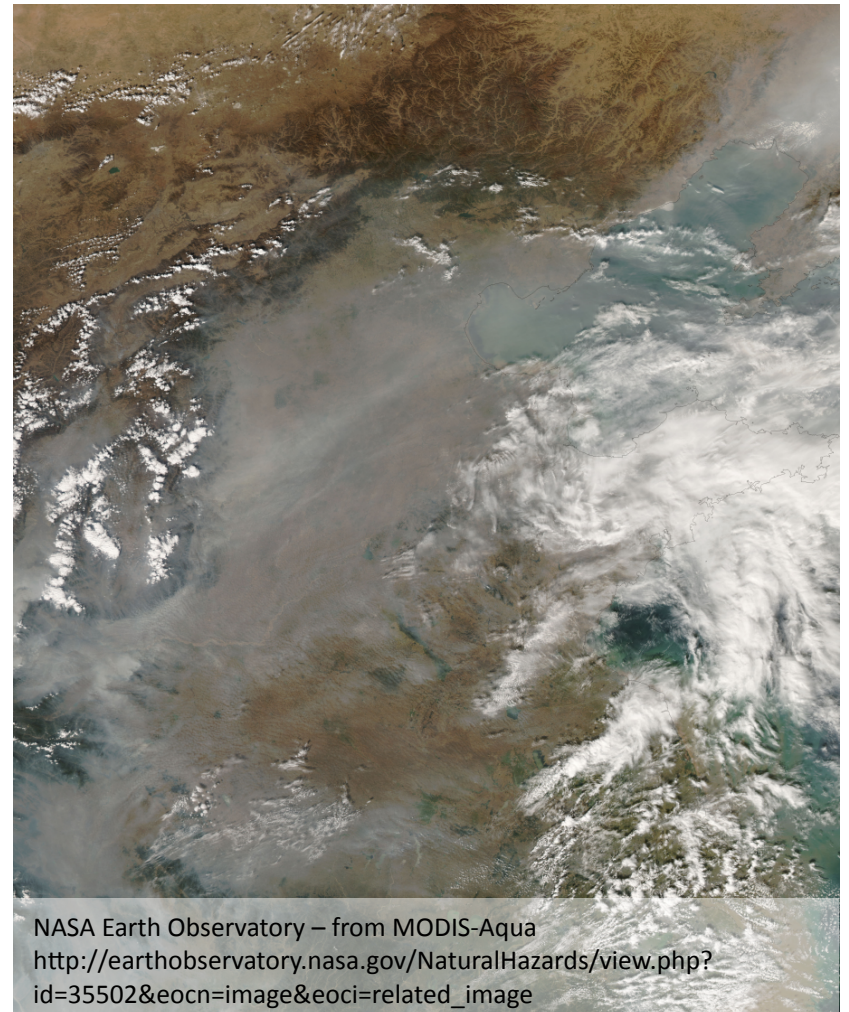
5 selected days Sep 2008 – safety zone included by Aerosol\_cci



- Aerosol CCI applies a tight cloud flagging criteria.
- Cloud CCI misidentifies some thick aerosol as cloud
- Many observations are considered neither clear nor cloudy so that the global TOA radiance field simulated from the two products is not representative of the satellite measured field.

# Bayesian cloud flagging

- Chinese haze event on 16-Oct-2008
- A good example of where traditional cloud flagging might struggle!
- AATSR processed:
  - Cloud\_cci product
  - Aerosol\_cci
  - “Bayesian” retrieval using cloud\_cci processor



NASA Earth Observatory – from MODIS-Aqua  
[http://earthobservatory.nasa.gov/NaturalHazards/view.php?id=35502&eocn=image&eoci=related\\_image](http://earthobservatory.nasa.gov/NaturalHazards/view.php?id=35502&eocn=image&eoci=related_image)

# Theory

- OE retrieval provides statistics on the quality of the fit
  - In particular the retrieval cost is directly related to the conditional probability of the retrieved state given the measurement (for a particular set of assumptions):

$$J = -2 \ln P(\mathbf{x}|\mathbf{y})$$

- Can we use this information to distinguish between cloud and aerosol (and different cloud/aerosol types)?

# $\chi^2$ test

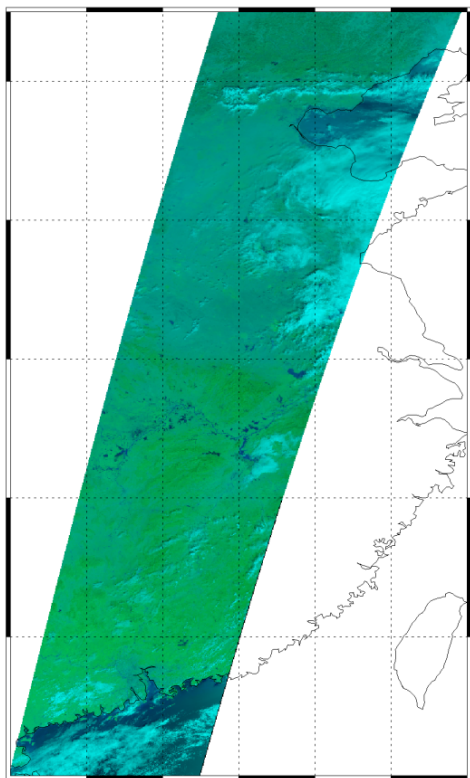
- Measurement cost function:

$$J_m = [\mathbf{y} - \mathbf{f}(\mathbf{x})] \mathbf{S}_y^{-1} [\mathbf{y} - \mathbf{f}(\mathbf{x})]$$

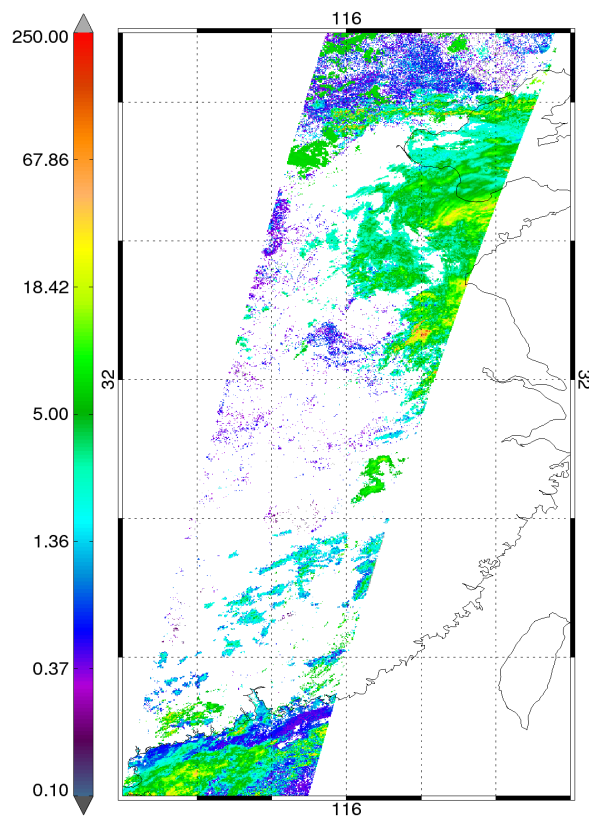
will be a random sample from a normal distribution with a standard deviation of 1, with degrees of freedom equal to the number of measurements,  $m$ .

- Thus, it should follow a  $\chi^2$  distribution with  $m$  degrees of freedom and each  $J_m$  value can thus provide a probability that the retrieval is consistent with the measurement
- *Assumes that the covariance matrix,  $\mathbf{S}_y$ , is an accurate representation of the uncertainty in the system and that the forward model,  $\mathbf{f}(\mathbf{x})$ , is a good representation of the physics of the measurement.*
- Similar argument can be applied to the a priori cost.

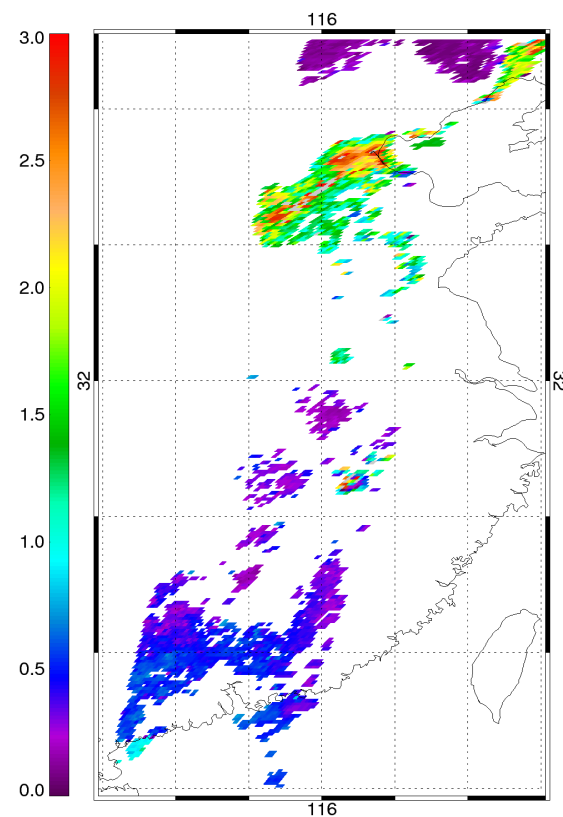
# Cloud and Aerosol cci consistency



AATSR false colour

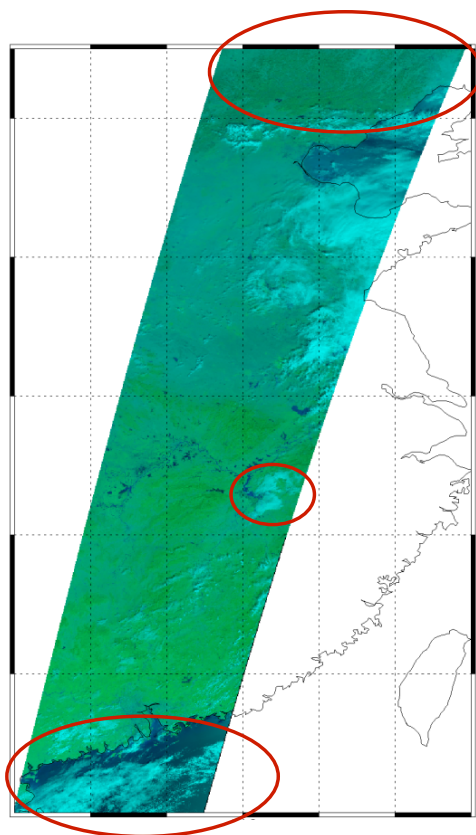


Cloud\_cci L2 (CC4CL)  
cloud optical depth

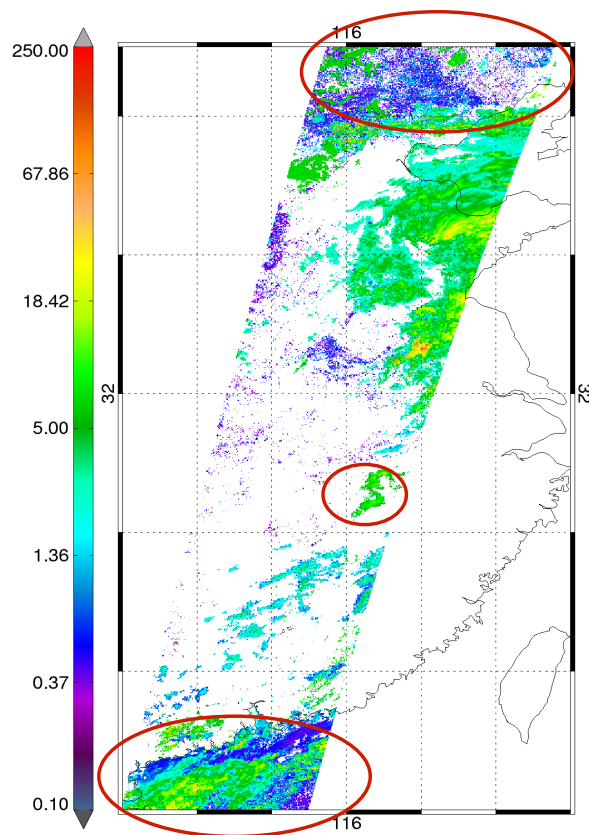


Aerosol\_cci L2 (ORAC)  
aerosol optical depth

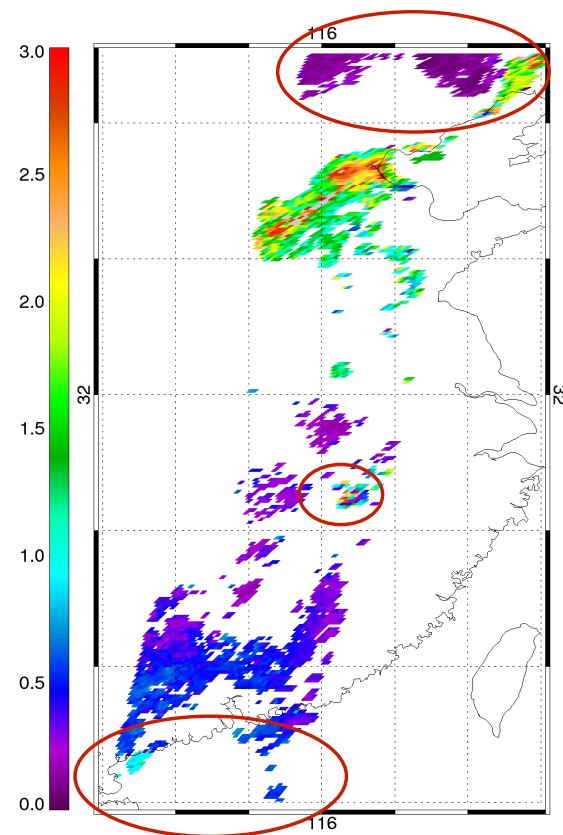
# Cloud and Aerosol cci consistency



AATSR false colour

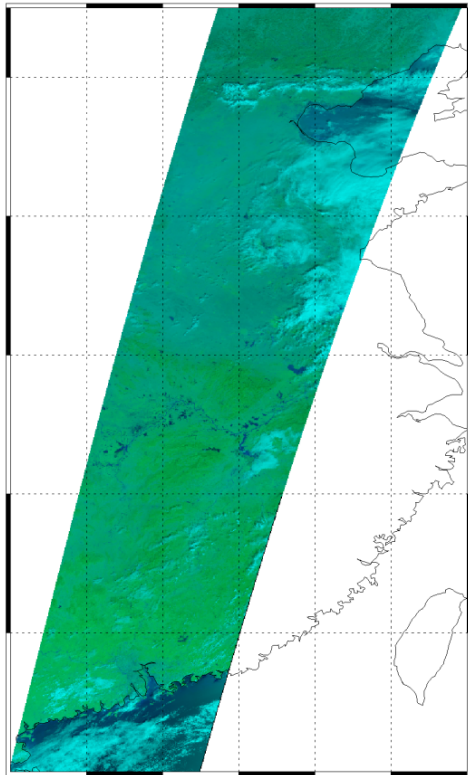


Cloud\_cci L2 (CC4CL/ORAC)  
cloud optical depth



Aerosol\_cci L2 (ORAC)  
aerosol optical depth

# Bayesian approach...



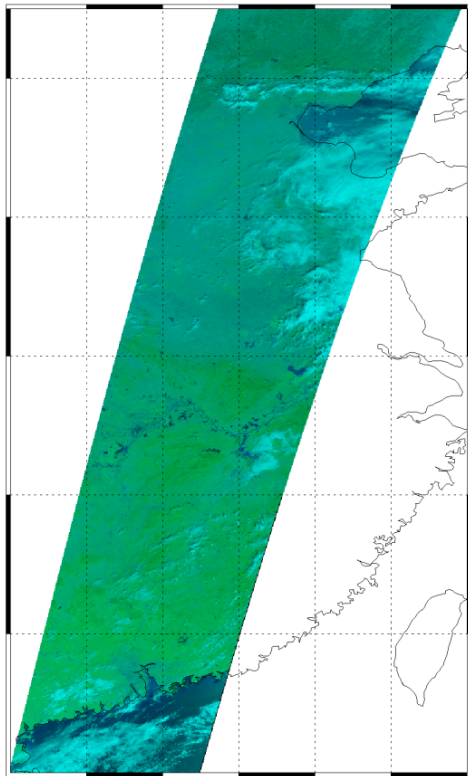
AATSR false colour

CC4CL cloud\_cci processor re-run on the scene shown:

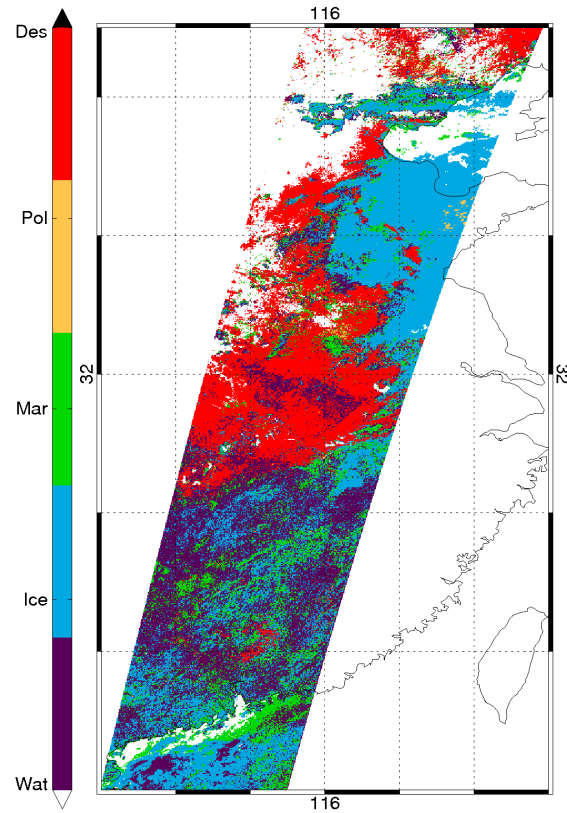
- Run with:
  - Water & ice cloud
  - Desert dust (OPAC with a non-spherical coarse mode)
  - Maritime class (OPAC at 80%RH)
  - Pollution (OPAC polluted continental)
- Used OPAC rather than aerosol\_cci classes because the thermal IR properties needed



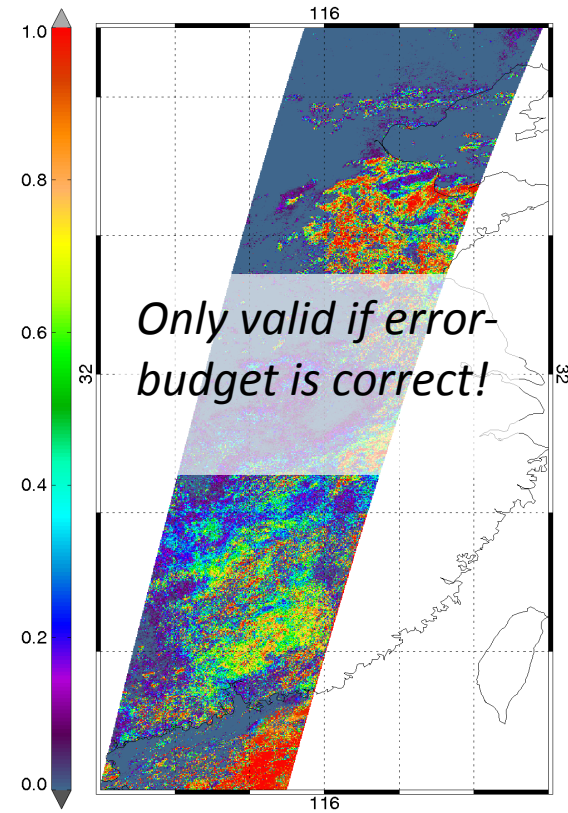
# $\chi^2$ results



AATSR false colour

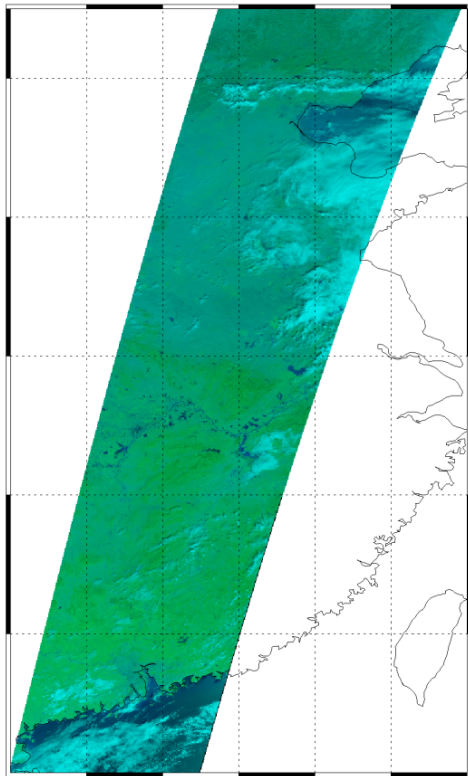


Best-type according to  $\chi^2$  test.



$\chi^2$  probability of best-type.

# Interpreting the results



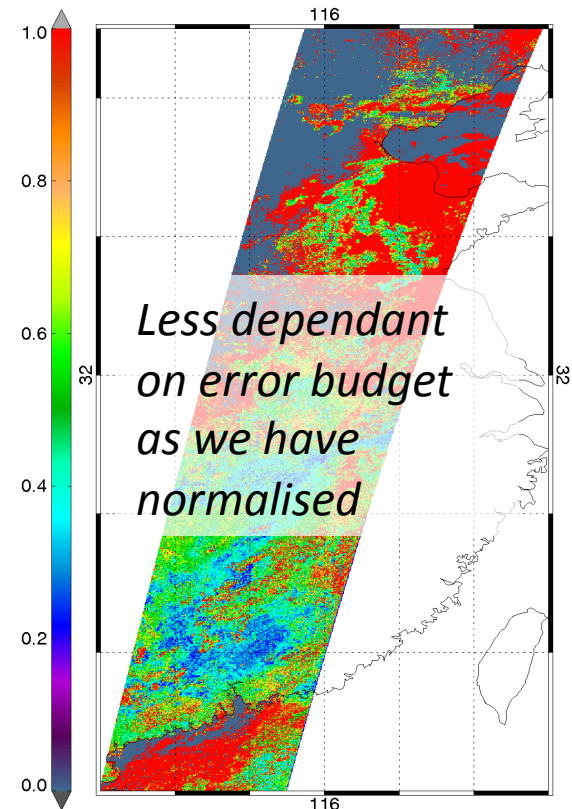
AATSR false colour

Of the available types, how certain are we of the best fitting?

- Normalise the probability:

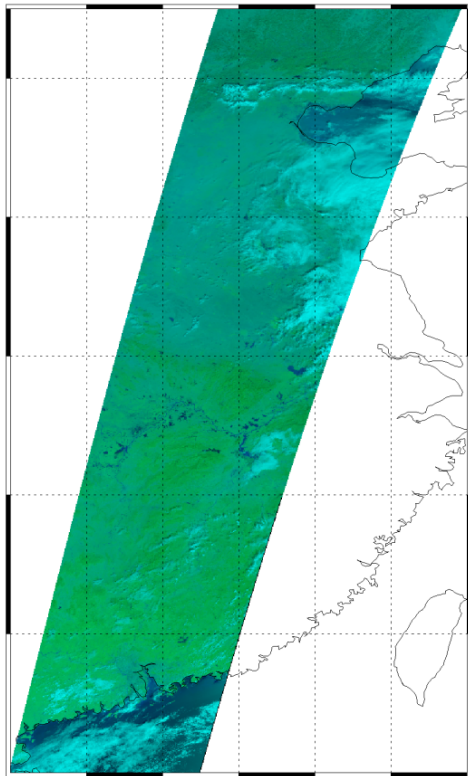
$$P_n = P_b / [\sum_i P_i]$$

- This can be used as a “cloud mask”

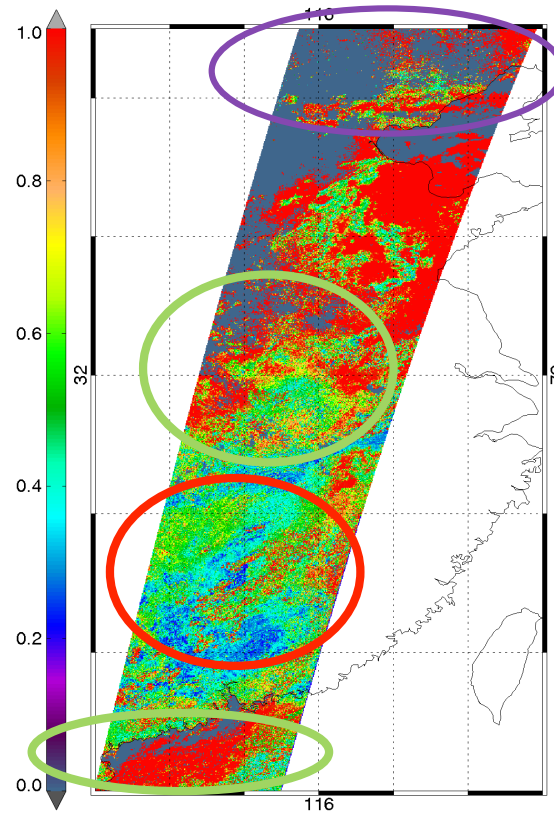


Normalised  $\chi^2$  probability of best-type.

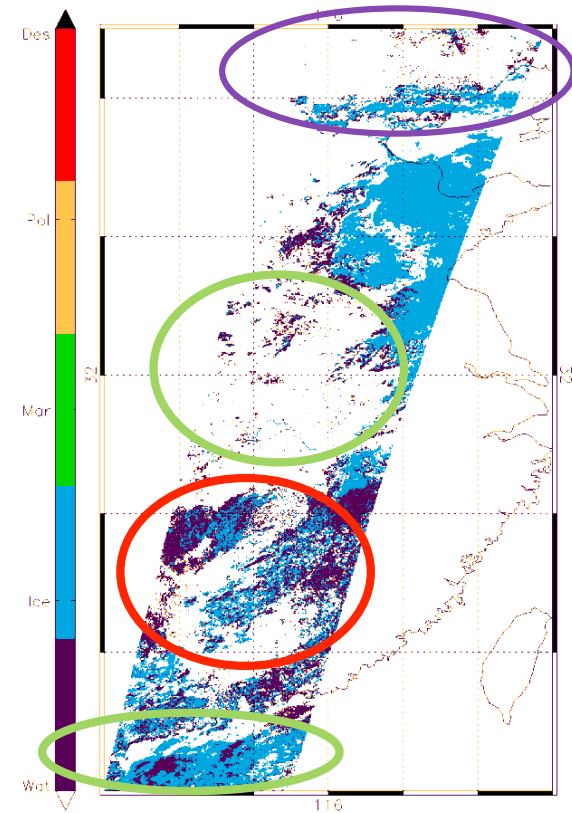
# Does it work?



AATSR false colour



Normalised probability



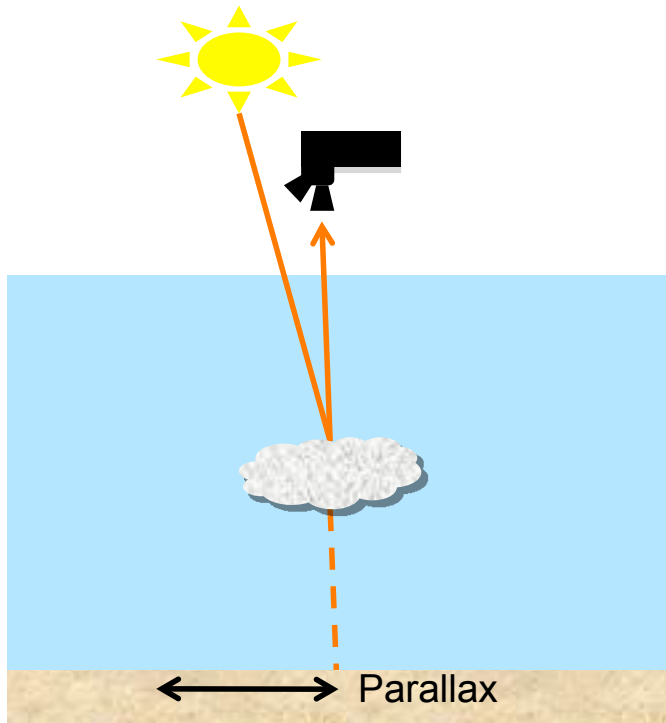
$\chi^2$  cloud phase. Either:

- $P_n > 0.75$  of water or ice
- Sum of  $P_n > 0.85$  for water and ice

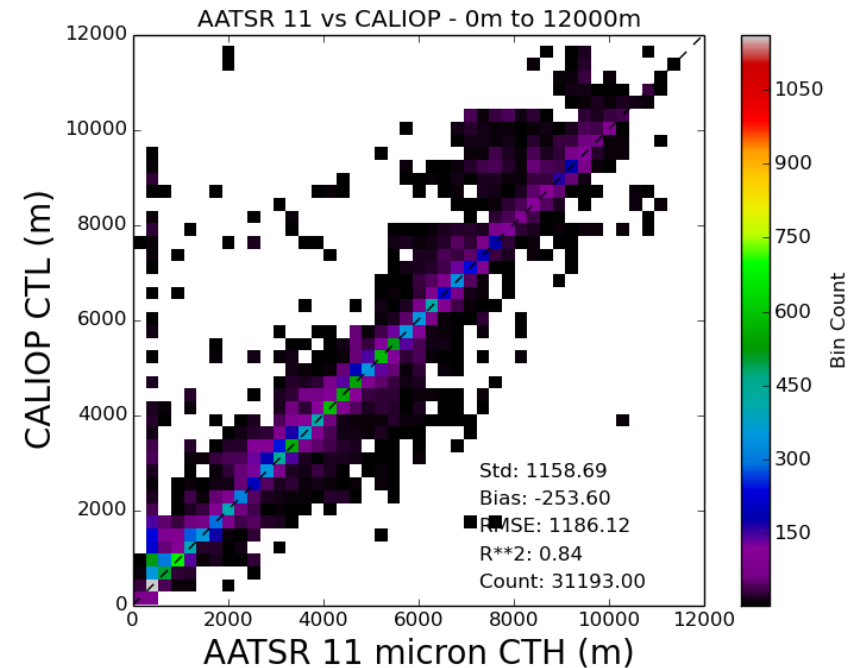
# Success?

- The method shows both promise and potential problems. In this case:
  - Is not “tricked” by Chinese haze or sediment laden coastal waters.
    - The latter in particular seems to be a problem with the neural net mask.
    - Haze is a problem in Aerosol CCI
  - Both CCI and Bayesian scheme can fit very thin water cloud to (what appear to be) some clear sky pixels.
  - We don’t really get a cloud mask.
    - The question we are asking is “is our forward model consistent with observations”?
- Could be used in conjunction with NN and other techniques

# Future: Stereo cloud top height



Comparison of retrievals over Greenland



- Stereo cloud top height will be used in OE retrieval as a priori information
- Dan Fisher/ JP Muller UCL- Census algorithm

# Future work

- Some way to harmonising aerosol and cloud identification
- Improve treatment of uncertainty propagation
- Investigate ways of improving treatment of multi layer clouds and thin cirrus.

End

# A test case

- Cumulative distribution of cost is very close to expected  $\chi^2$  distribution
- Note that the conditional probability  $P(\mathbf{x} | \mathbf{y})$  is pretty close to the  $\chi^2$  probability, but they are not the same

