

# **Bias in MODIS cloud drop effective radius for oceanic water clouds as deduced from measured cloud optical thickness variability across scattering angles**

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# Background

❑ For MODIS-VIIRS-type systems, the Nakajima and King (1990)-type retrievals of cloud optical depth ( $\tau$ ) and effective radii ( $R_e$ ) remains the state-of-the-art and is rooted in the 1-D RT assumption.

• **Passive retrievals rooted in 3-D RT are decades away for global products**

❑ We have a good handle on random errors under 1-D RT formulation from Platnick *et al.* (2004)... reported in product.

• **These errors match those had by observations for  $H\sigma \sim 0$  (Di Girolamo *et al.* 2010)**

❑ Systematic errors, principally from the breakdown of 1-D RT for heterogeneous clouds, remain largely unknown in any global sense.

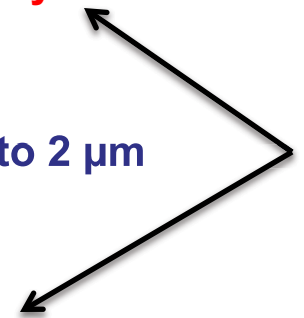
**3-D RT  
Simulations**

**Marshak *et al.* (2006):  $R_e$  overestimate by  
~ factor of 2 are possible**

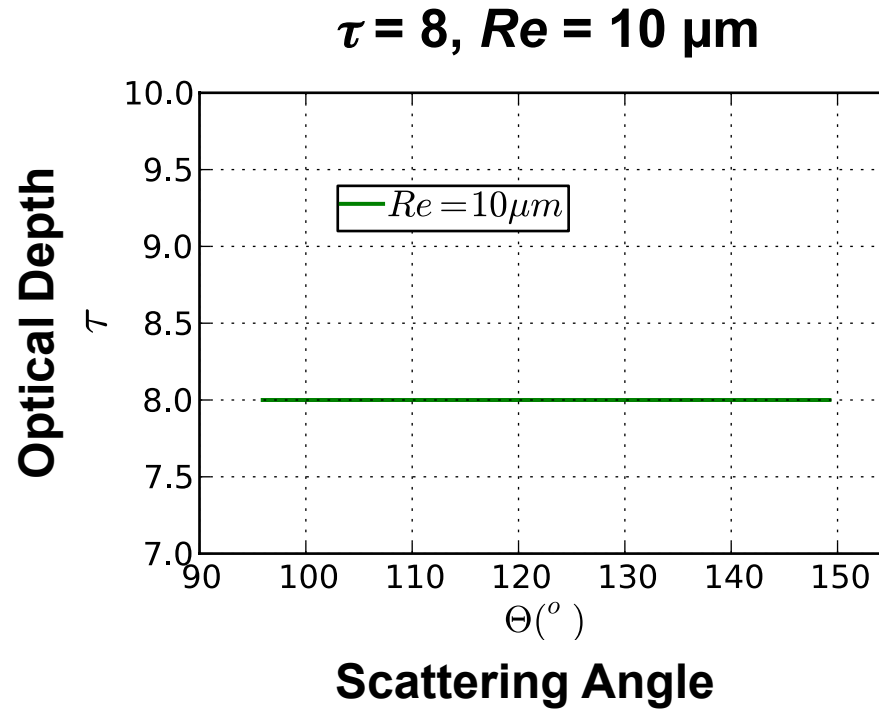
**Painemal and Zuidema (2011)  $R_e$  bias ~ +1 to 2  $\mu\text{m}$   
Stratocumulus, high sun**

**Field  
Validation**

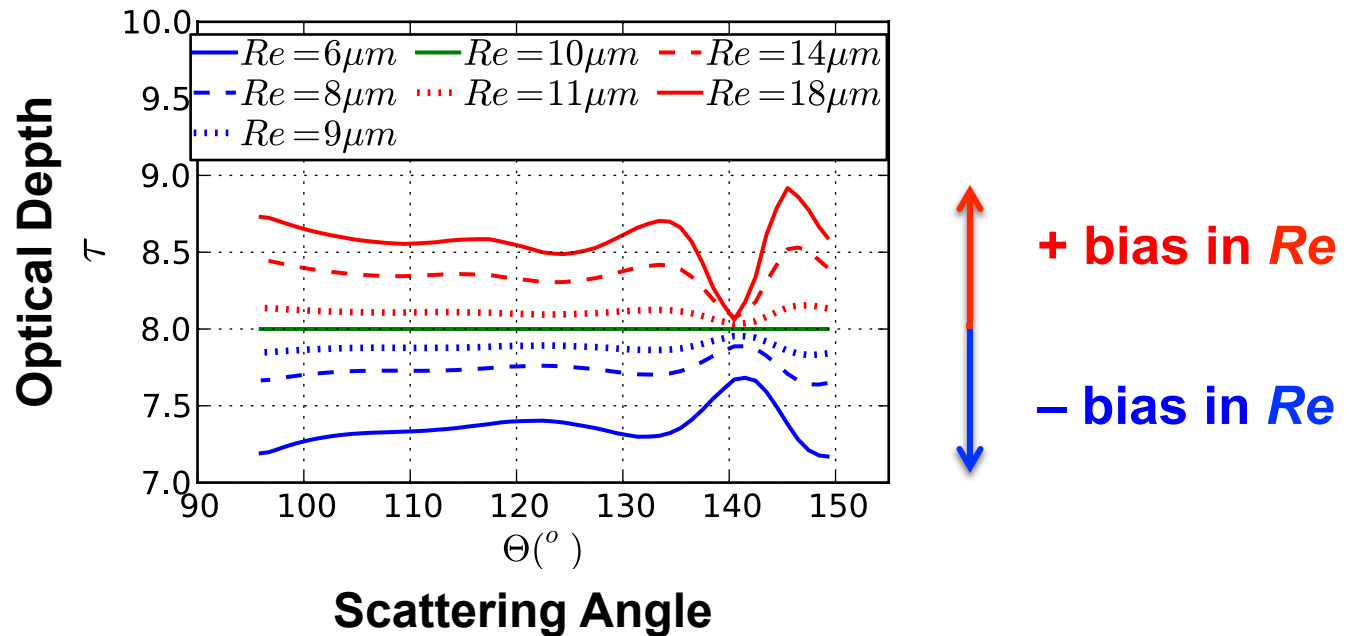
**Haney (2013)  $R_e$  bias ~ +7 to 12  $\mu\text{m}$   
Trade Cumulus, high sun**



# How do we characterize the *Re* bias over the globe?

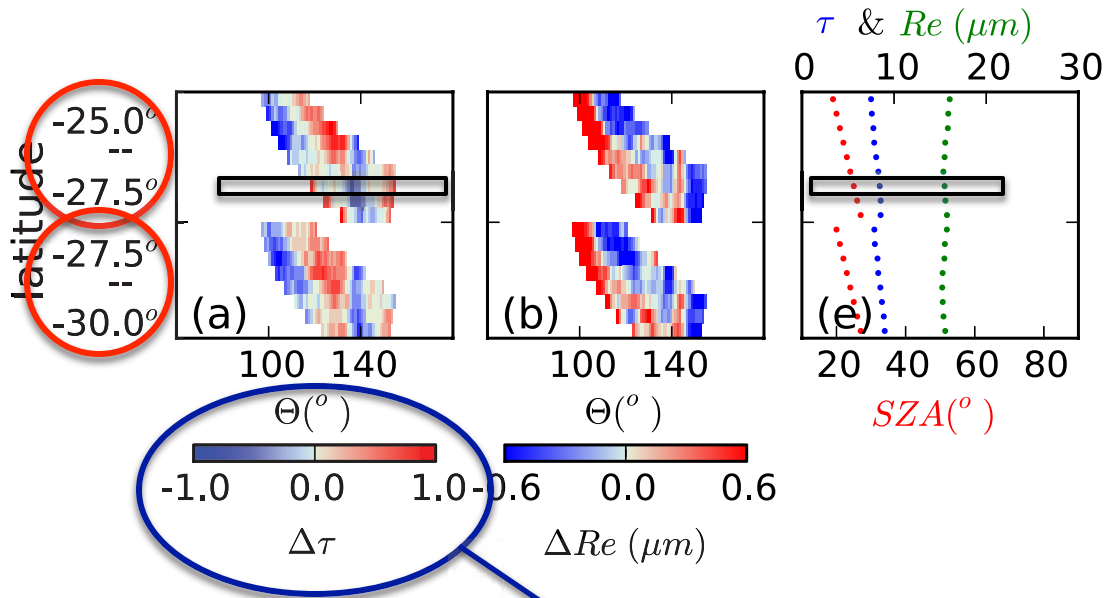


**“Rainbow-dips”** in the observations would indicate an **overestimate** of the retrieved  $Re$



**“Rainbow-bumps”** in the observations would indicate an **underestimate** of the retrieved  $Re$

# MODIS Terra: January only, 2001-2012



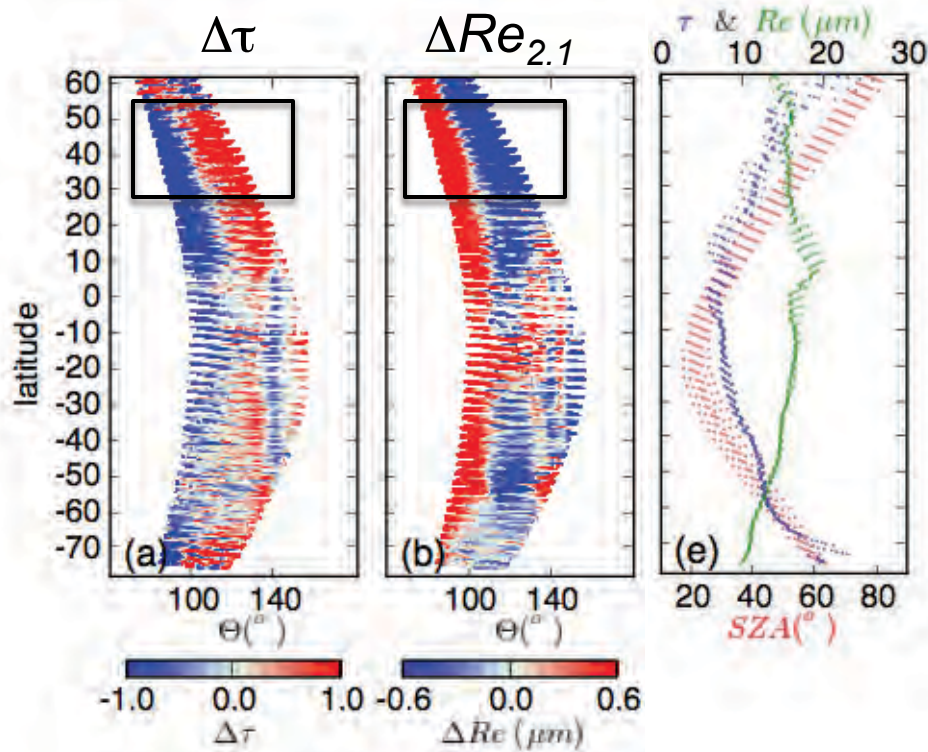
Latitude bins =  $2.5^{\circ}$

Solar zenith angle bins =  $1^{\circ}$

$$\Delta x = x - \langle x \rangle$$

$\langle x \rangle$  = mean within lat-SZA bin

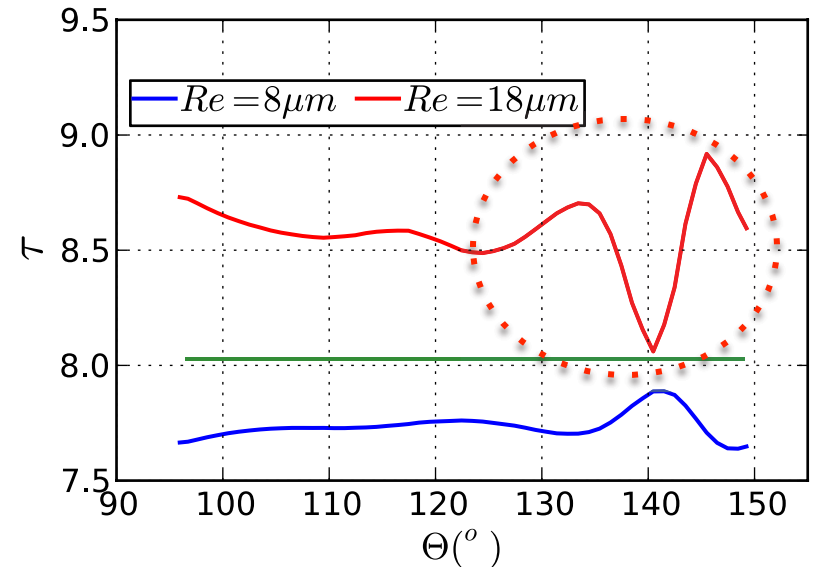
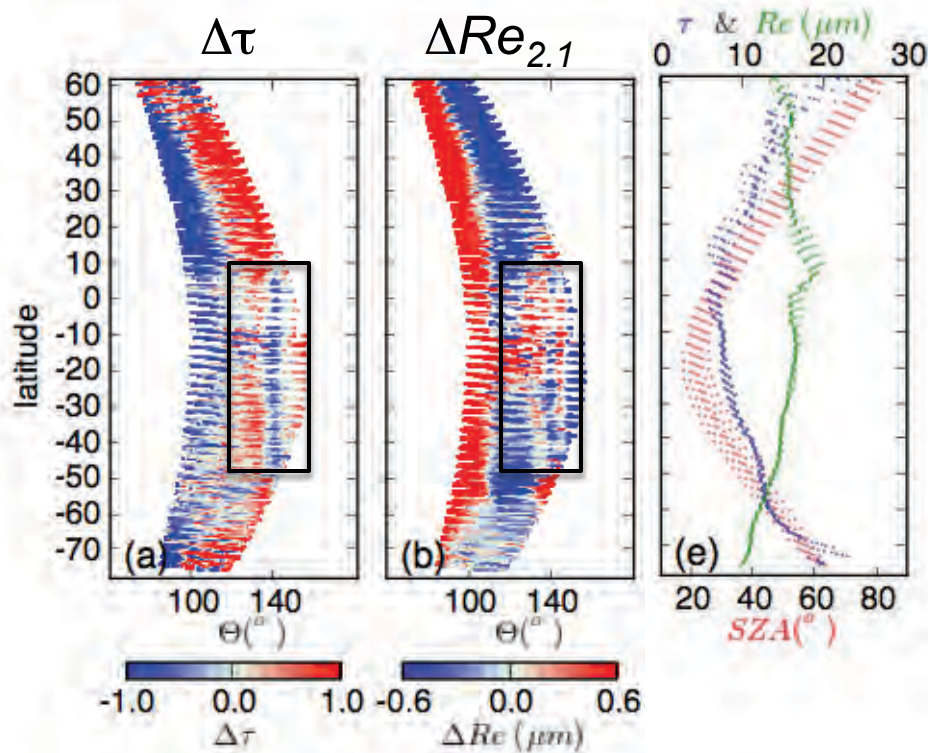
# MODIS Terra: January only, 2001-2012



Traditionally interpreted as  
3-D effects

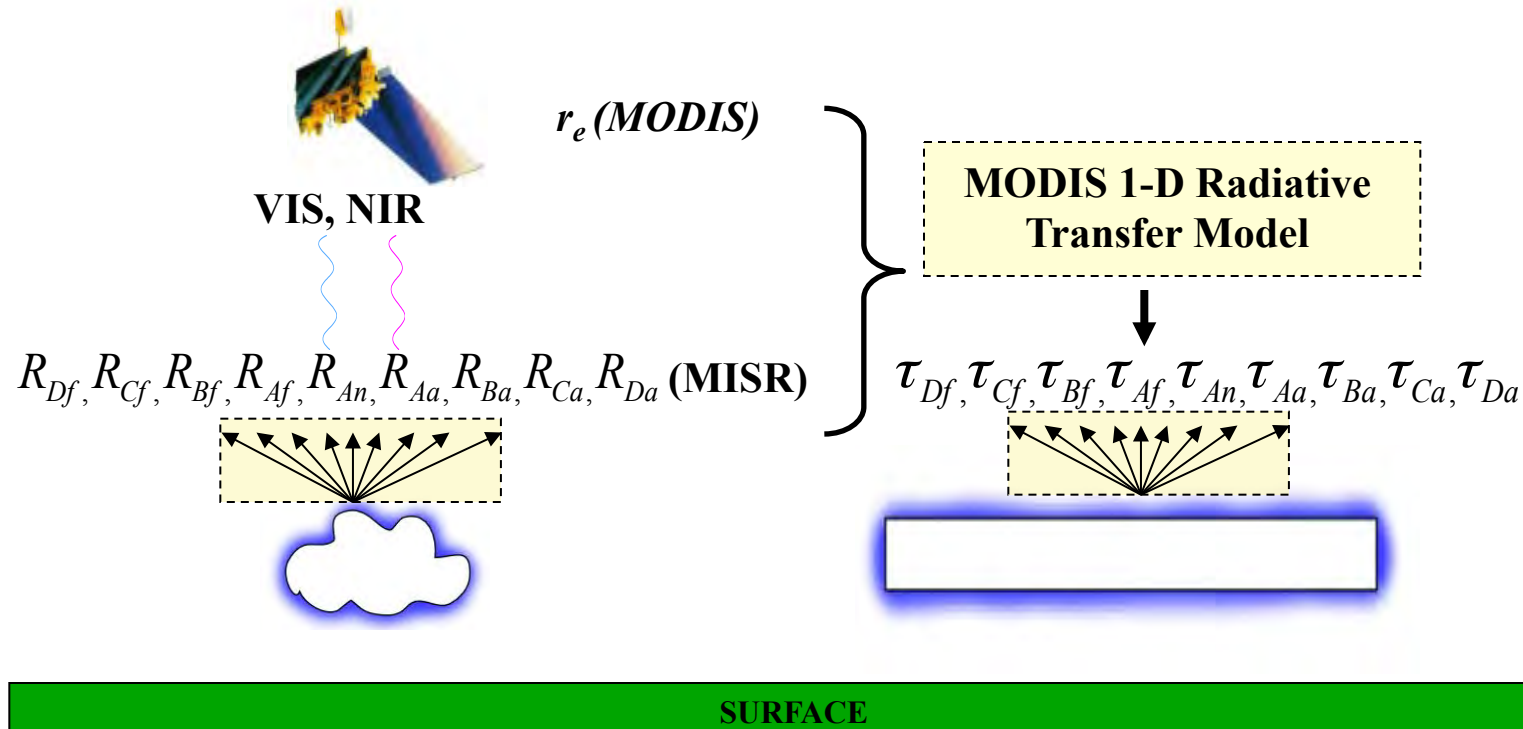
Loeb and Coakley (1998)  
Varnai and Marshak (2007)  
Liang and Di Girolamo (2013)  
Horvath et al. (2014)

# MODIS Terra: January only, 2001-2012



***The presence of the “rainbow-dip” unequivocally shows the presence of a positive bias in the MODIS Re2.1 product***

# Collocated MISR + MODIS on Terra



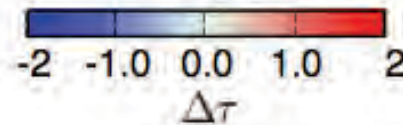
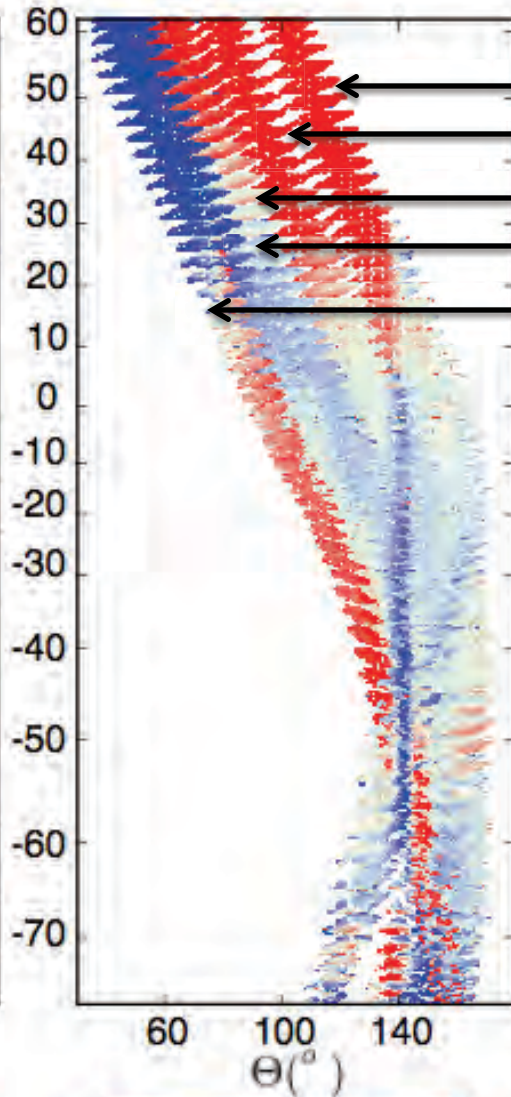
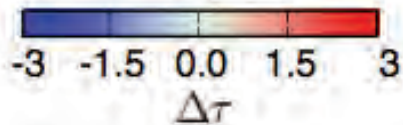
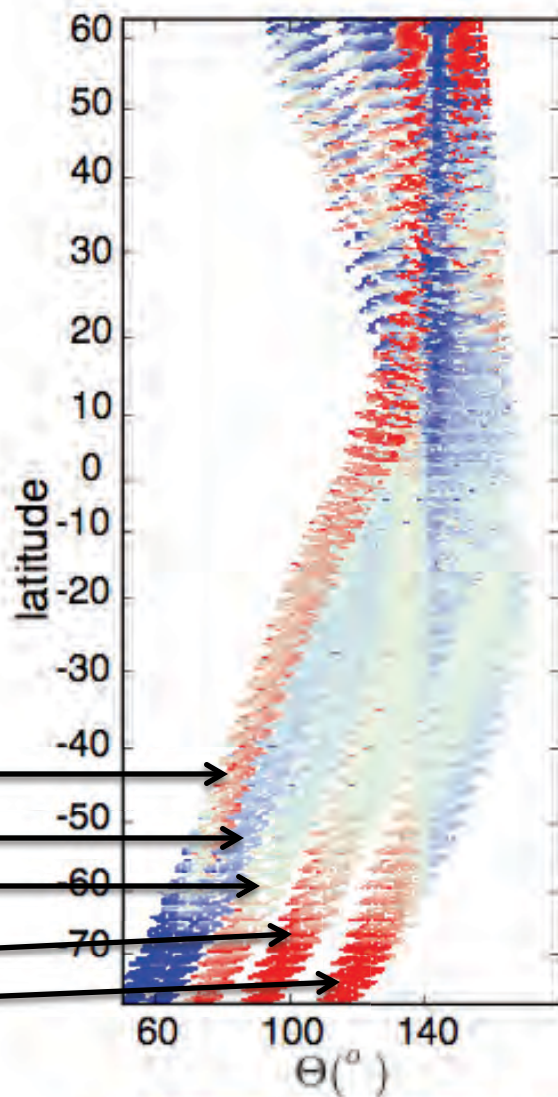


# Collocated MISR + MODIS on Terra

Forward  
Cameras

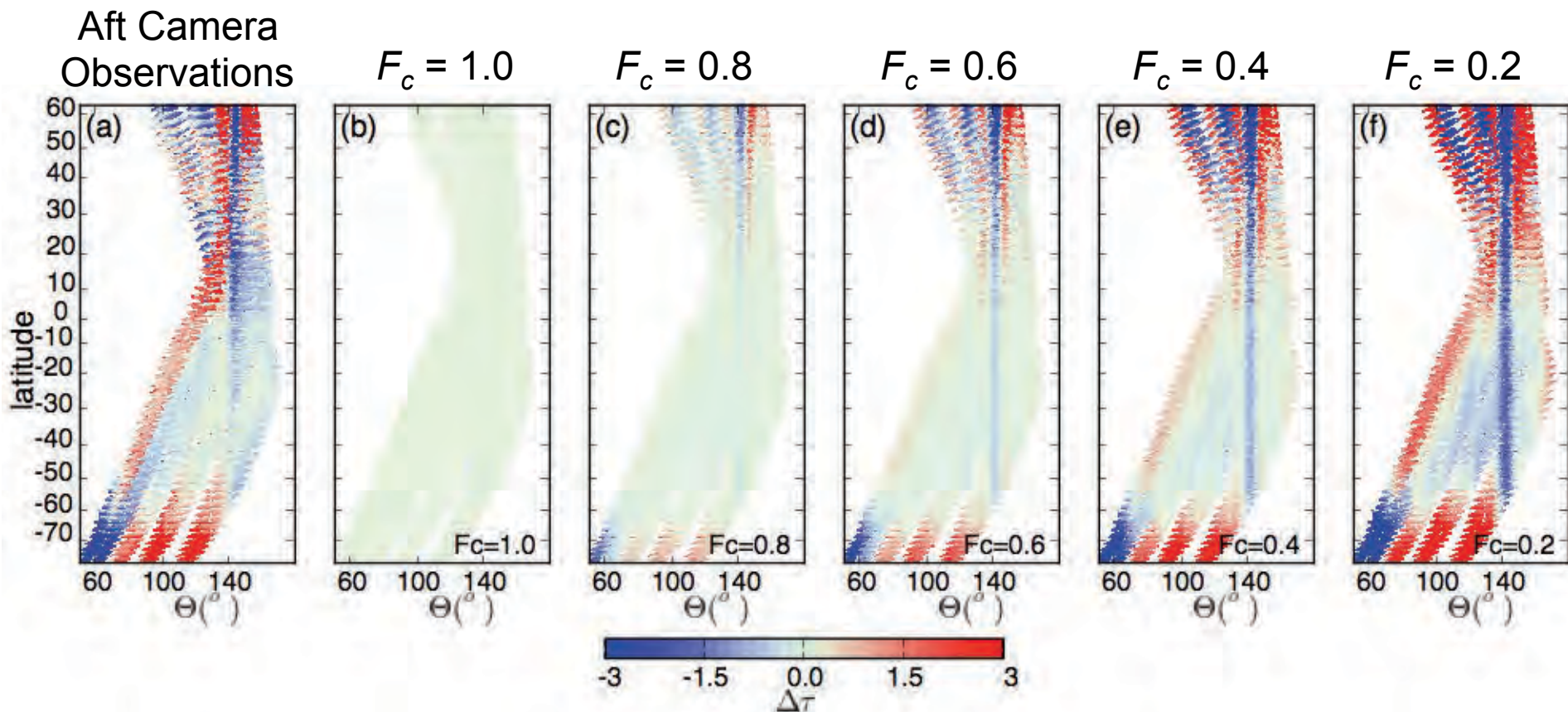
Aft  
Cameras

70.5° (DA)  
60.0° (CA)  
45.5° (BA)  
26.5° (AA)  
0° (AN)



70.5° (DF)  
60.0° (CF)  
45.5° (BF)  
26.5° (AF)  
0° (AN)

- For each SZA-latitude bin, take true  $\tau = \text{mean } \tau$  from AN camera
- Assume true  $Re = F_c \times Re_{2.1}$
- These are used in 1-D RT calculations to produce  $0.866 \mu\text{m}$  BRFs at the MISR sun-view geometries
- Use these BRFs and  $Re_{2.1}$  to retrieve  $\tau$



**This range of  $F_c$  best matches the observations  
(i.e., a high bias of 20 to 60% in the zonal mean *Re2.1*)**



Aft Camera  
Observations

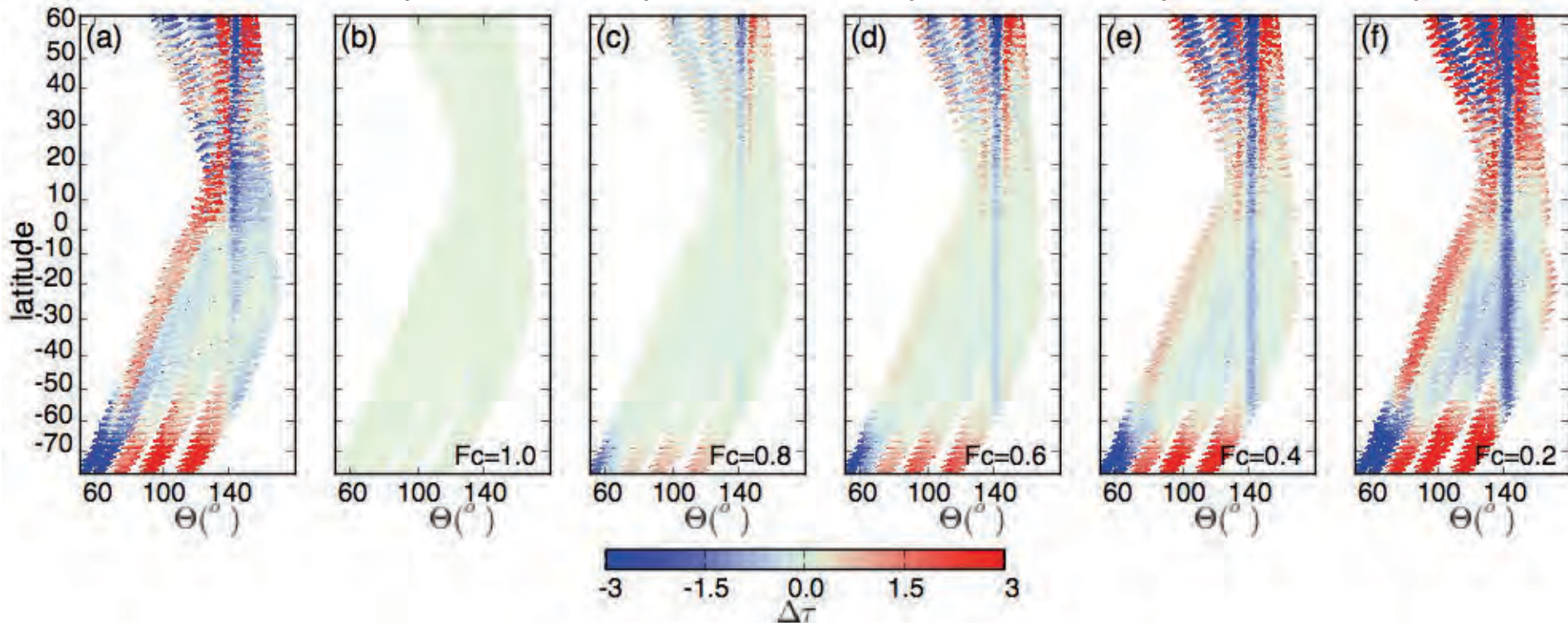
$F_c = 1.0$

$F_c = 0.8$

$F_c = 0.6$

$F_c = 0.4$

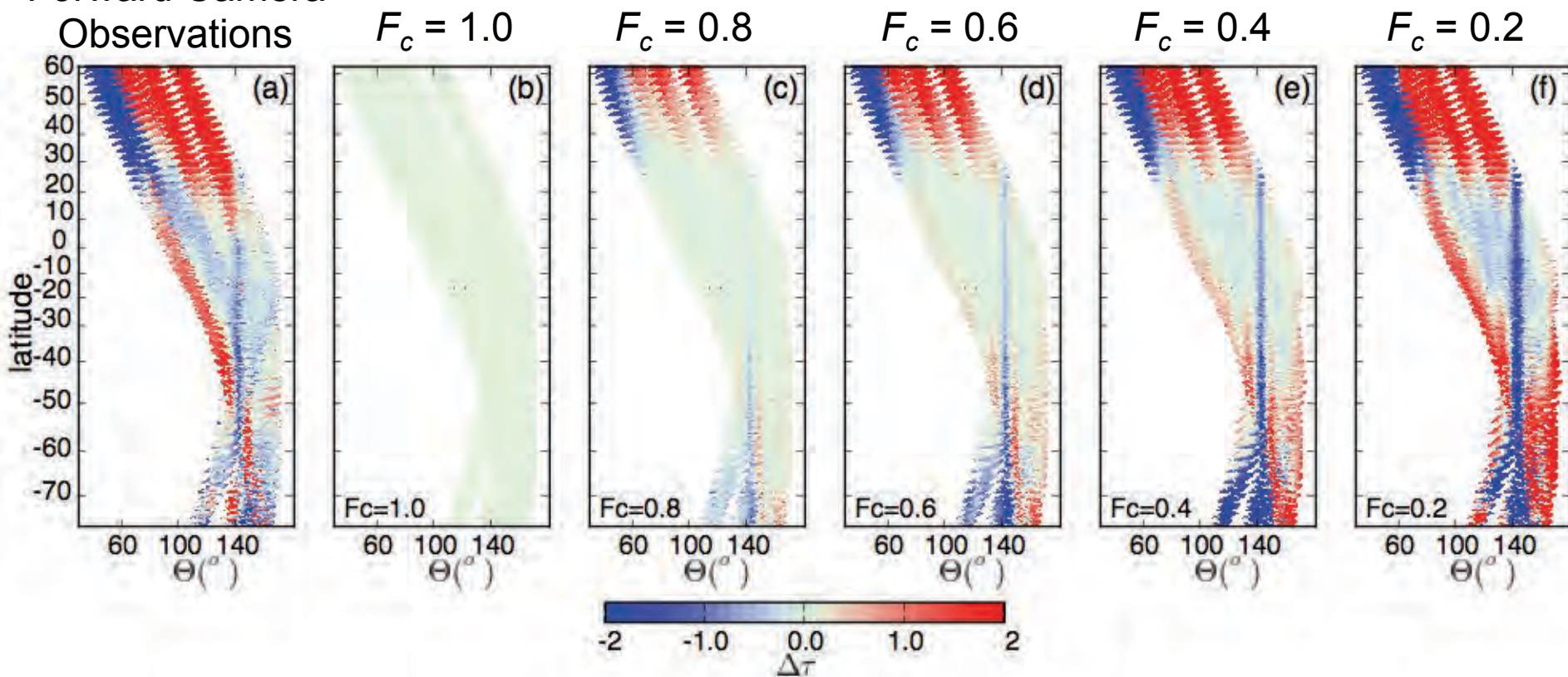
$F_c = 0.2$



**This range of  $F_c$  best matches the observations (i.e., a high bias of 20 to 60% in the zonal mean *Re2.1*)**

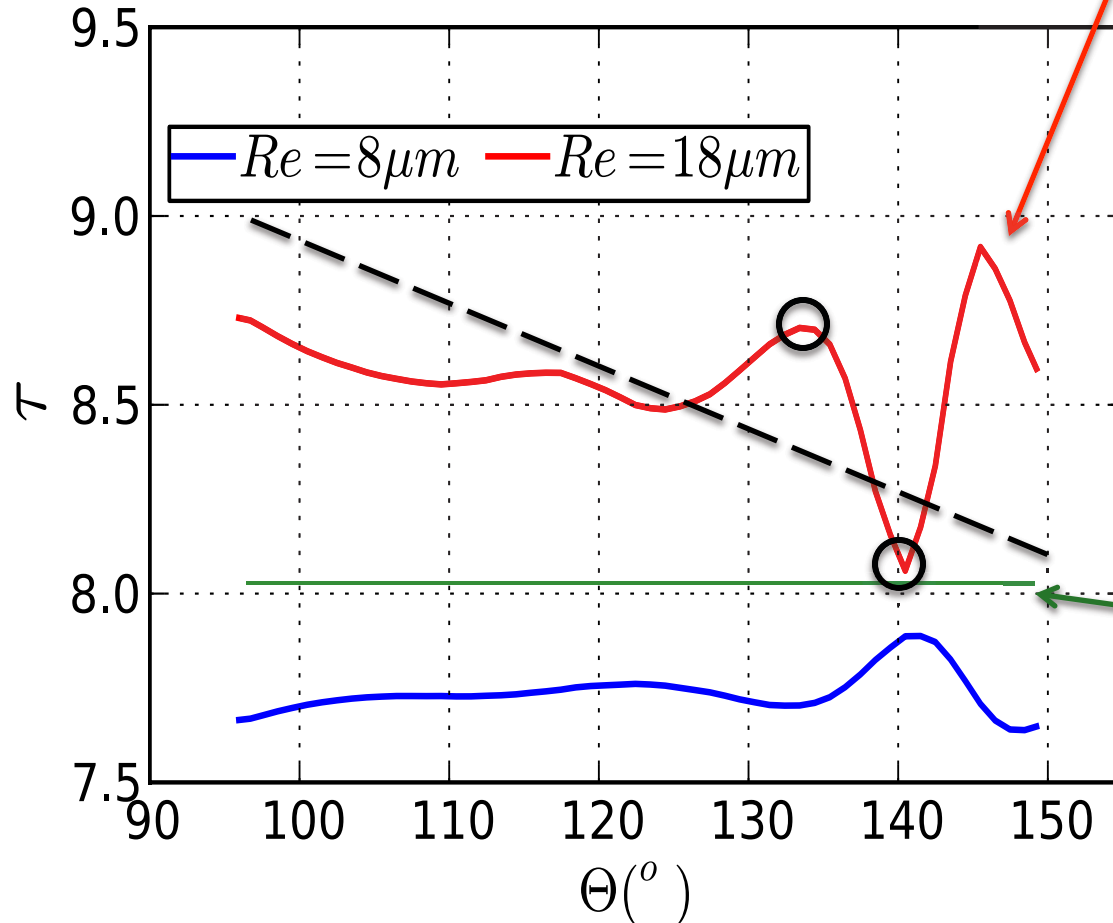


Forward Camera  
Observations



But there's  $\tau$  variation due to 3D effects!

MISR retrieved  $\tau$  using  
MODIS  $Re_{2.1} = 18 \mu m$



Use  $Re = Re_{2.1} \times F_c$

Iterate

$F_c = 1.00$

$F_c = 0.99$

$F_c = 0.98$

.

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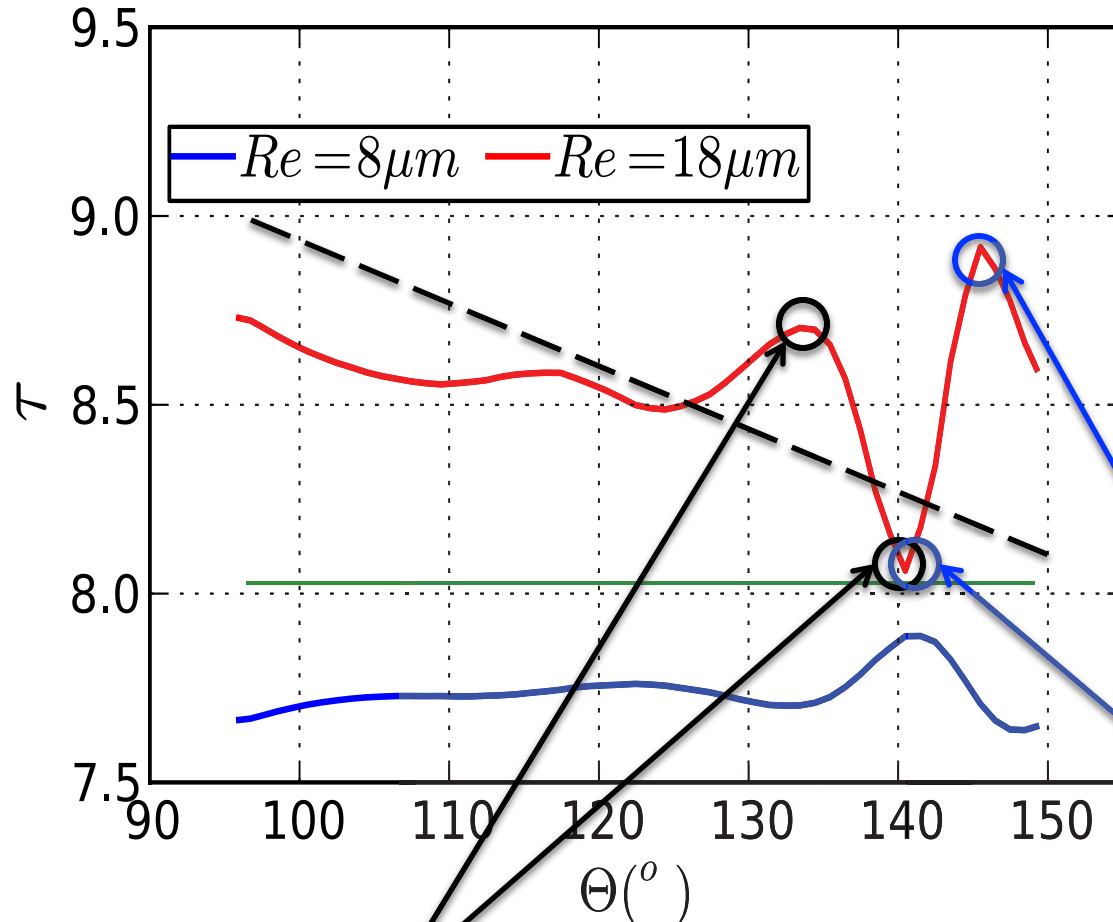
$F_c = 0.56$

$Re = 18 \mu m \times 0.56 = 10 \mu m$

Biased... Argh!!!

Use MISR observations at any two points that are part of the rainbow dip

**Fortunately, in many latitude bins, MISR observes both sides of the rainbow dip from multiple camera pairs**



**So while we can't compute a zonal mean bias in retrieved  $Re$ , we can put bounds on it**

- **Amplitude is enhanced by 3D**
- **Retrieval of  $F_c$  biased low**
- **Overestimate of  $Re$  bias**

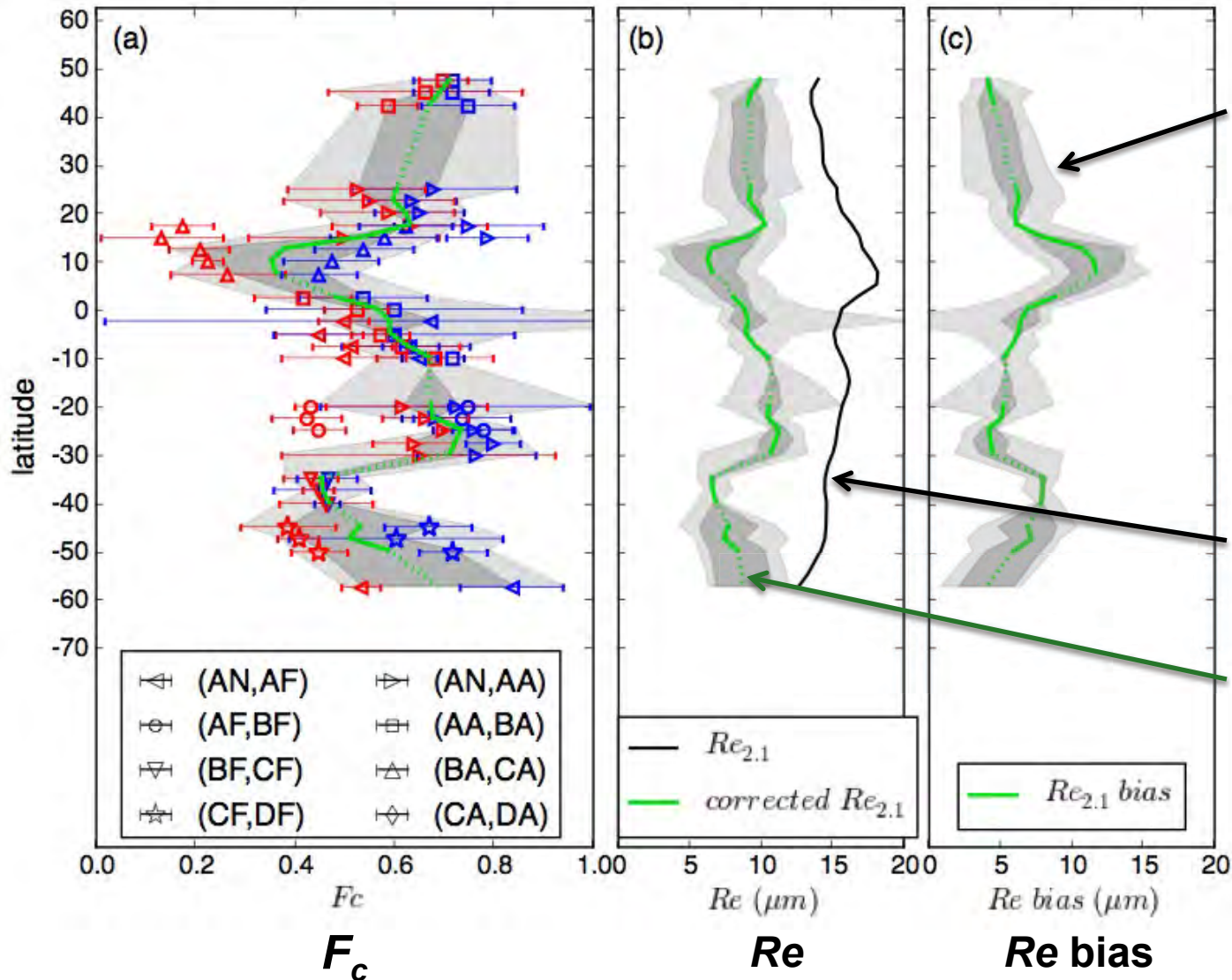
- **Amplitude is reduced by 3D**
- **Retrieval of  $F_c$  biased high**
- **Underestimate of  $Re$  bias**

Red = lower bound of zonal mean  $F_c$  computed from all SZA bins within a latitude bin

Blue = upper bound of zonal mean  $F_c$  computed from all SZA bins within a latitude bin

Green = midpoint of upper and lower bound

January



Zonally varying MODIS  $Re_{2.1}$  bias of ~ 3 to 11  $\mu m$  in zonal mean values

Zonal mean  $Re_{2.1}$

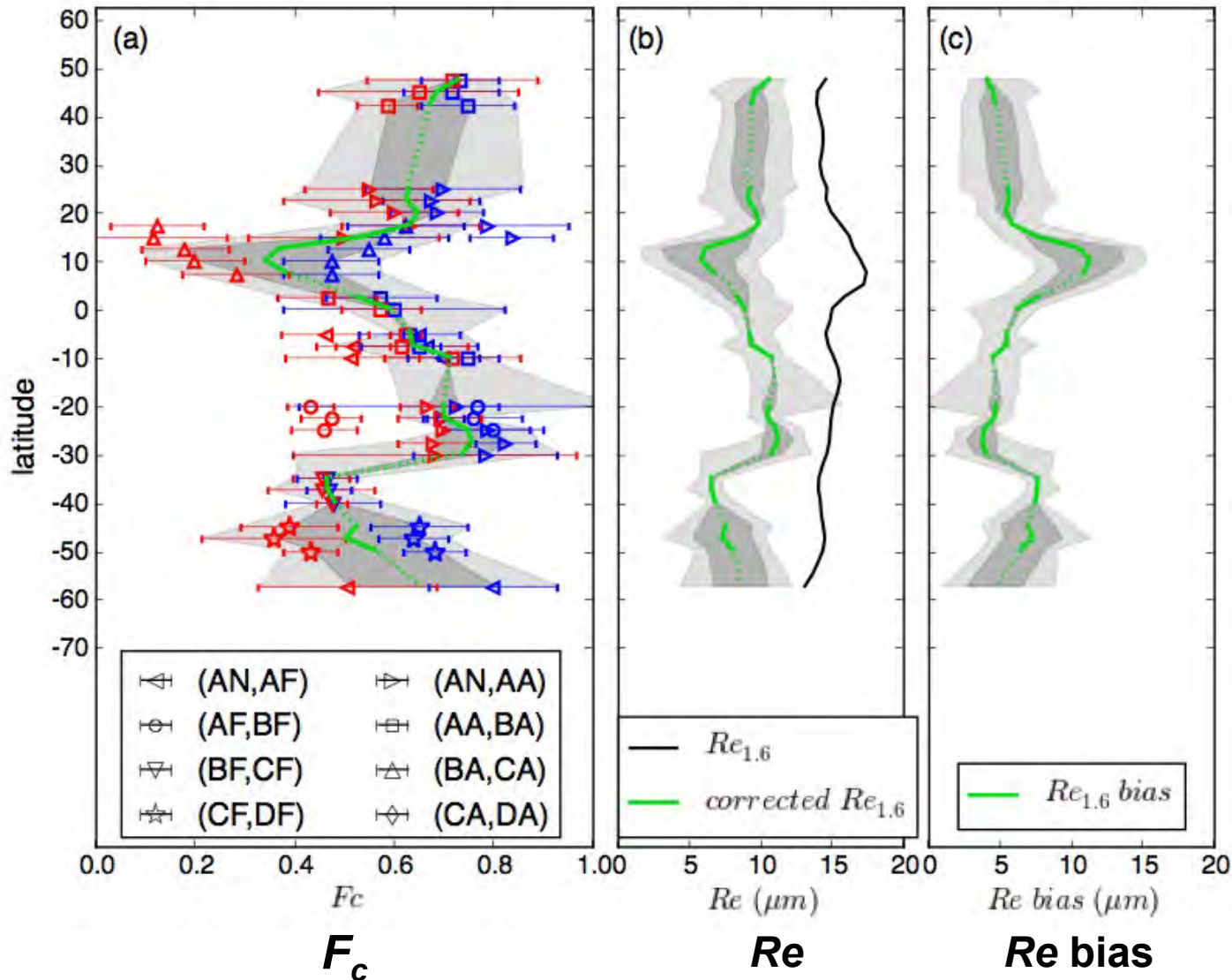
Bias-corrected zonal mean  $Re_{2.1}$

Red = lower bound of zonal mean  $F_c$  computed from all SZA bins within a latitude bin

Blue = upper bound of zonal mean  $F_c$  computed from all SZA bins within a latitude bin

Green = midpoint of upper and lower bound

January



Zonally varying  
MODIS  $Re_{1.6}$  bias  
of  $\sim 3$  to  $11 \mu\text{m}$  in  
zonal mean values

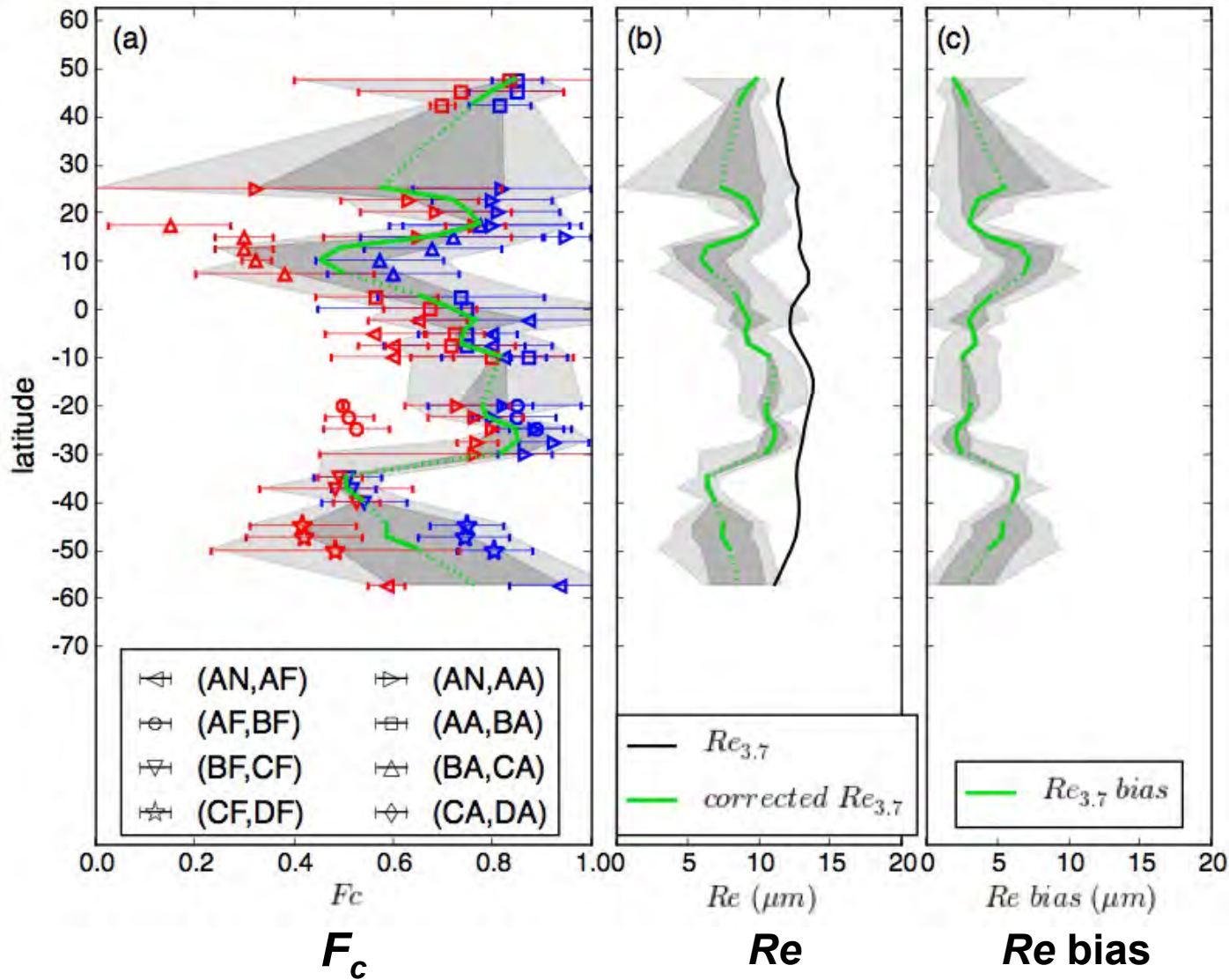


Red = lower bound of zonal mean  $F_c$  computed from all SZA bins within a latitude bin

Blue = upper bound of zonal mean  $F_c$  computed from all SZA bins within a latitude bin

Green = midpoint of upper and lower bound

January

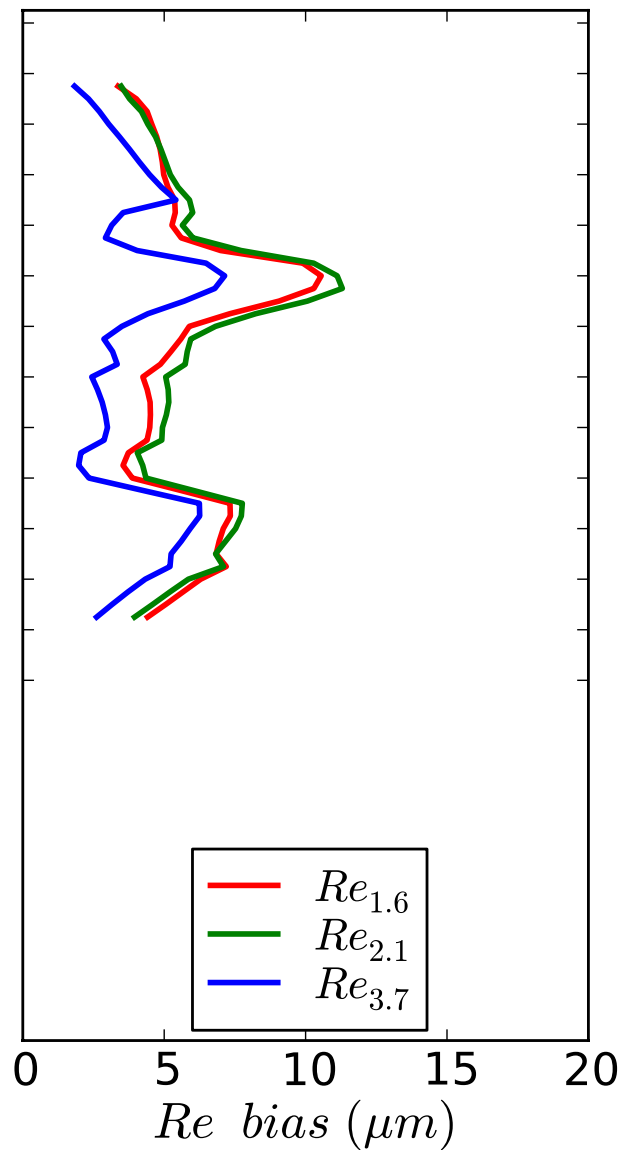
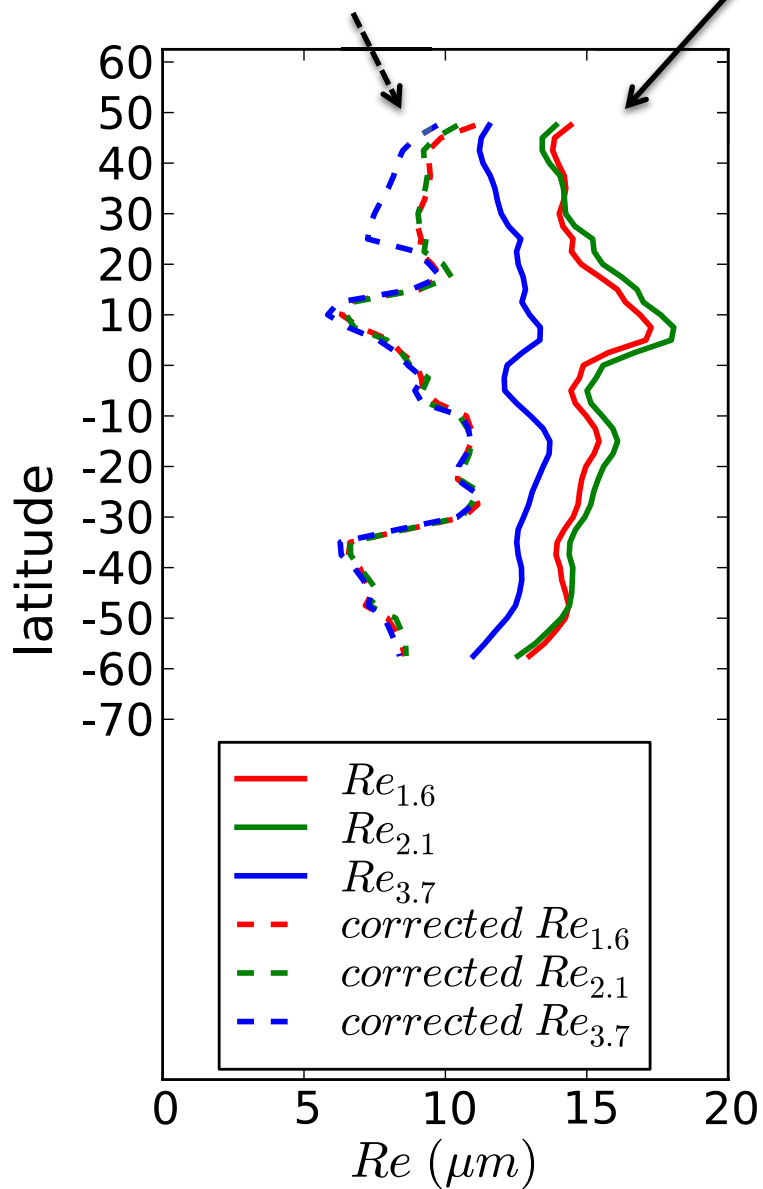


Zonally varying  
MODIS  $Re_{3.7}$  bias  
of  $\sim 2$  to  $7 \mu m$  in  
zonal mean values

**Bias corrected  
mid-point of bounds**

**Original**

**January**



## Summary

- ❑ Through MISR-MODIS fusion, we established bounds on the zonally mean bias in the samples of the MODIS-retrieved  $Re$
- ❑ Midpoints of bounds indicate  $\sim 3$  to  $11 \mu\text{m}$  bias in zonal mean MODIS  $Re_{1.6}$ ,  $Re_{2.1}$ ,  $Re_{3.7}$  values (bias of  $Re_{3.7} < Re_{2.1} \sim Re_{1.6}$ )
- ❑ Bias-corrected  $Re$  channel differences are much smaller than original
- ❑ Large meridional differences between original and bias-corrected  $Re$

## What's Next for MODIS $Re$ Bias Correction?

- ❑ Quantification that gets at the mean bias rather than its bounds
- ❑ New MISR-MODIS fusion (i.e., Terra) product?
- ❑ Regress MISR-MODIS retrieved  $Re$  bias against variables that MODIS can measure (radiances, texture,  $\tau$ , SZA, etc)... Collection 7?

**Thanks!**

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**Cal Tech/JPL MISR Project**

**NASA Langley Research Center Atmospheric Sciences Data Center**

**Level 1 and Atmosphere Archive and Distribution System of NASA  
Goddard Space Flight Center**