

#### Assimilation of MODIS Snow Cover and GRACE Terrestrial Water Storage Data through DART/CLM4 Yong-Fei Zhang<sup>1</sup>, Zong-Liang Yang<sup>1</sup>, Tim J. Hoar<sup>2</sup>, Hua Su<sup>1</sup>, Jeffrey L. Anderson<sup>2</sup>, Ally M. Toure<sup>3,4</sup>, and Matthew Rodell<sup>4</sup>

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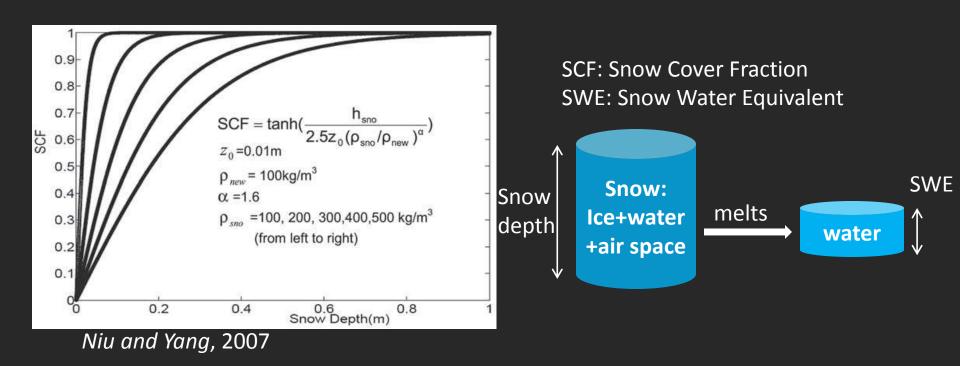


# Content

- DART/CLM4 land data assimilation system
- MODIS data assimilation
- MODIS and GRACE data assimilation
- New snow cover fraction parameterization scheme and its role in data assimilation

# Community Land Model v.4 (CLM4)

<u>http://www.cesm.ucar.edu/models/clm/</u>



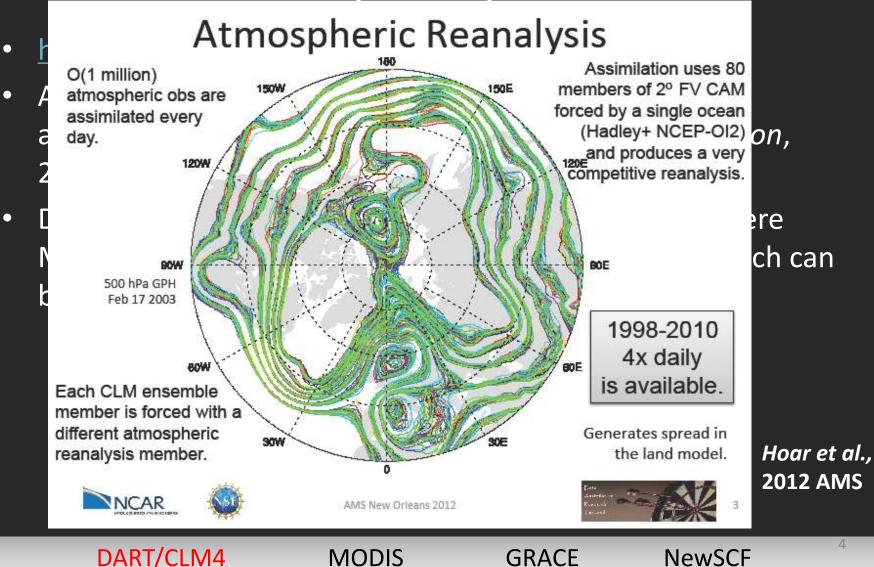
DART/CLM4

MODIS

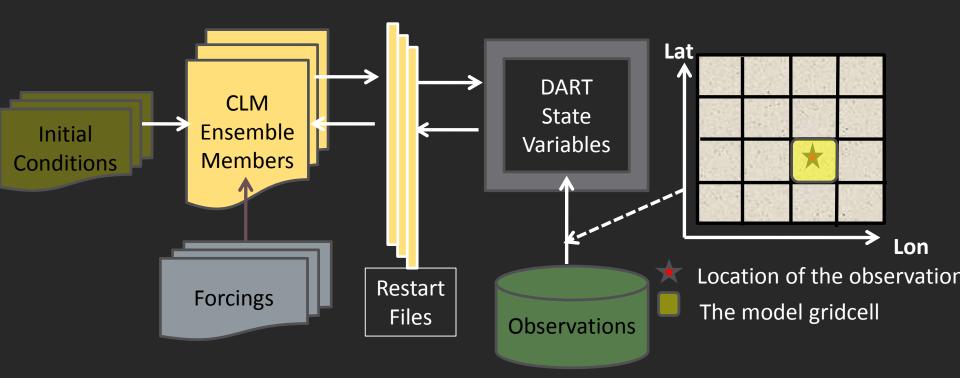
GRACE

**NewSCF** 

# Data Assimilation Research Testbed (DART)



### The Coupled DART and CLM4



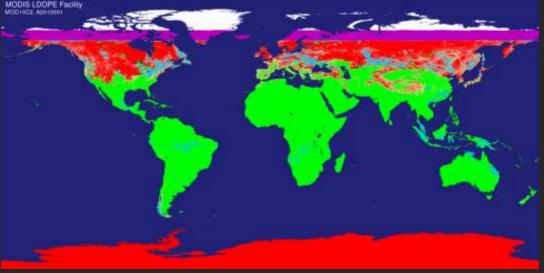
DART/CLM4

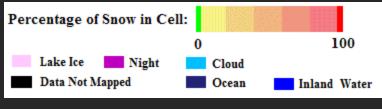
MODIS

GRACE

**NewSCF** 

### MODIS SCF data





http://landweb.nascom.nasa.gov/animation/

NewSCF

Daily MODIS observation

- MODIS/Terra daily snow cover (MOD10C2; 0.05° resolution; northern hemisphere)
  - Retrieved using NDSI

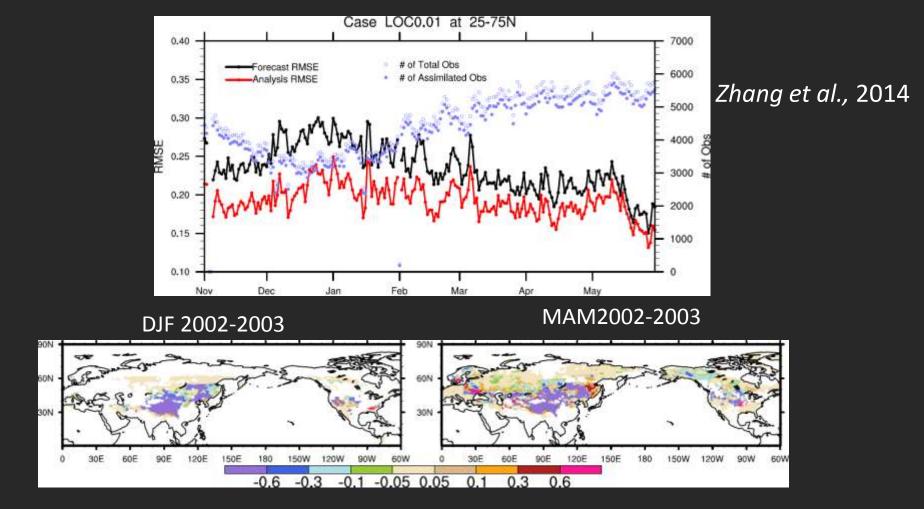
DART/CLM4

$$NDSI = \frac{band \ 4 - band \ 6}{band \ 4 + band \ 6}$$

GRACE

- Preprocessed to 0.9 ° x1.25 ° "Level 4" data
  - Pixels with lower than 20% confidence index (percentage of clear sky over certain grid) will be discarded.

MODIS



RMSE against MODIS data is reduced at each data assimilation step

Differences (data assimilation minus open loop) of normalized absolute bias of SCF against MODIS Cold color: improvements Warm color: degradation

DART/CLM4

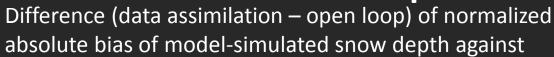
MODIS

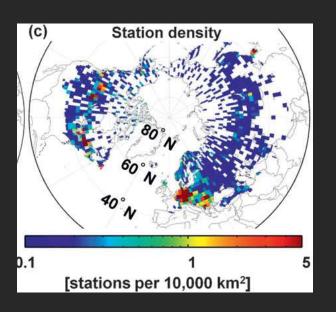
GRACE

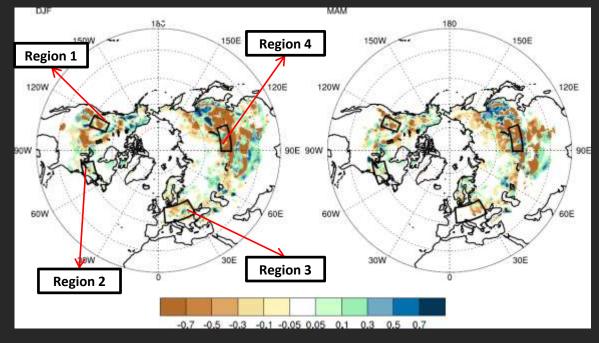


# Comparison with CMC snow depth

Site density map (*Reichle et al.*, 2011)







#### Brown: improvements

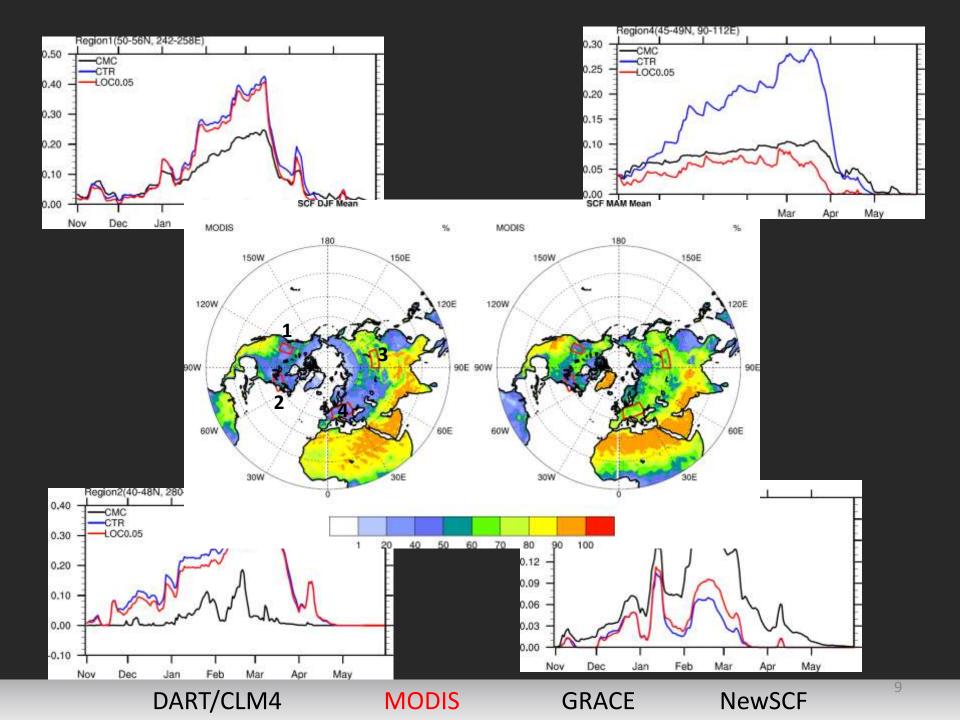
Blue: degradation

DART/CLM4

MODIS

GRACE





- The MODIS-only data assimilation results are generally closer to the CMC data in site-dense regions than the open loop case but are further away from the CMC data in some portions of the Northern Hemisphere where observations are sparse (e.g., in dense forests and high-elevation regions).
- Snow data assimilation has little impact on SCF at highermiddle and high latitudes in winter because SCF in CLM4 ensembles is close to unity with little ensemble spread.
- Limitations include:

DART/CLM4

Lack of observations due to sunlight and clouds

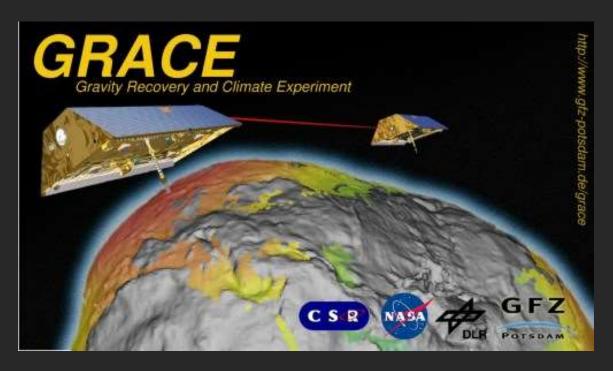
MODIS

Can not provide more information when snowpack is full

GRACE

### **GRACE** satellite data

 Different from MODIS that measures radiances, GRACE measures the distance between two satellites and retrieves land abnormal quantities from that.

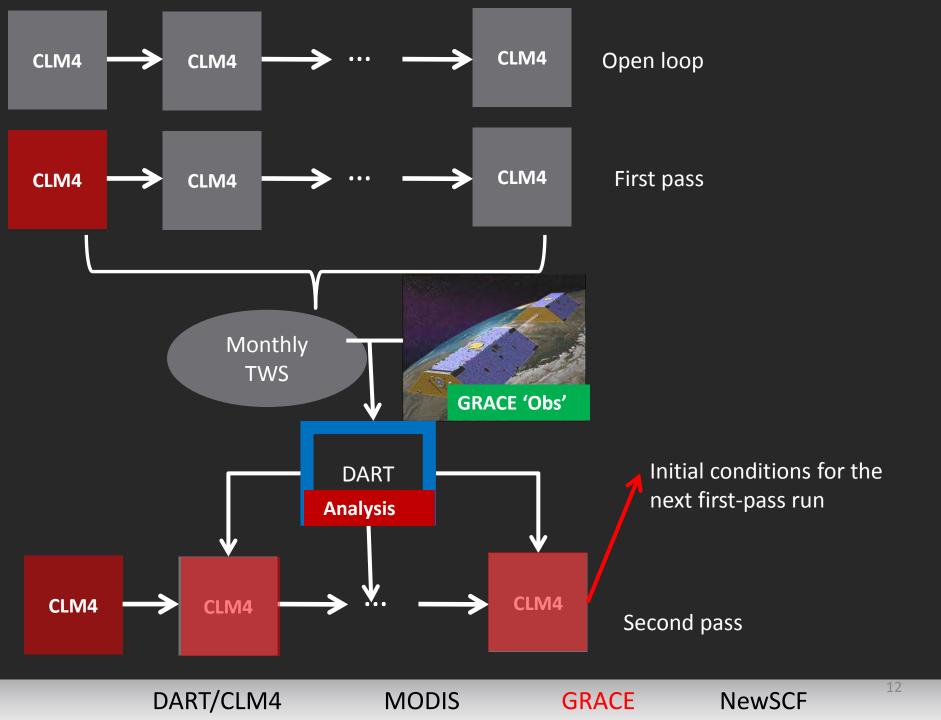


DART/CLM4

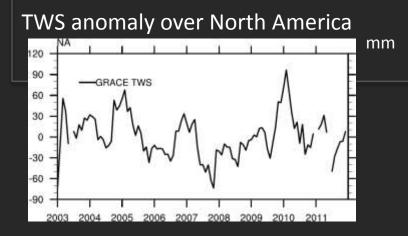
MODIS

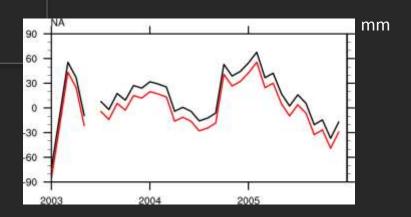
GRACE



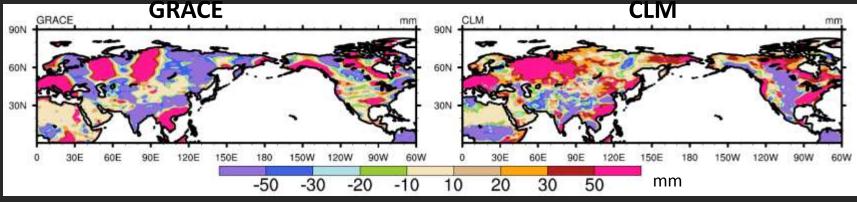


### **GRACE TWS** assimilation





**TWS anomalies for Jan 2003** 



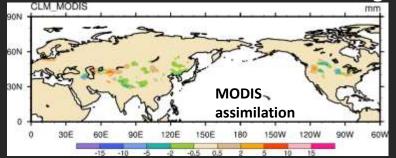
DART/CLM4

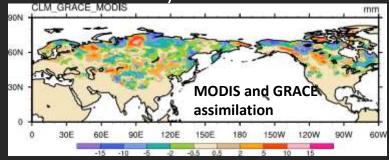
MODIS

GRACE

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#### Snow Water Storage (Posterior minus Prior)





CLM\_MODIS - CLM CLM\_GRACE\_MODIS - CLM 180 180 150E 150E 150W 150W 120E 120W 120E 120W 90E 90W 90E aow 60W 60W 60E 60E 30E 30E 30W 30W 0 0 0.1 0.3 0.5 0.7 -0.7 -0.5 -0.3 -0.1

DART/CLM4

MODIS

GRACE

**NewSCF** 

### TWS monthly anomaly from four data sources

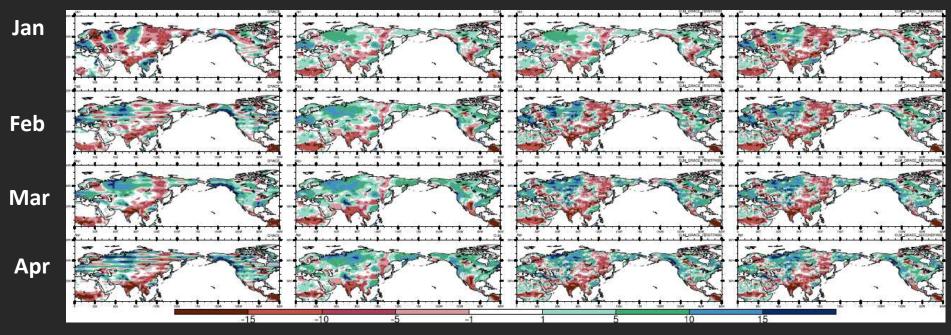
• Reference time period: 2003–2005

GRACE

Open loop

First pass

Second pass



cm

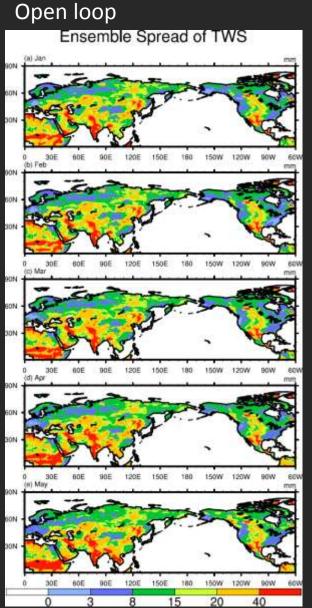
DART/CLM4

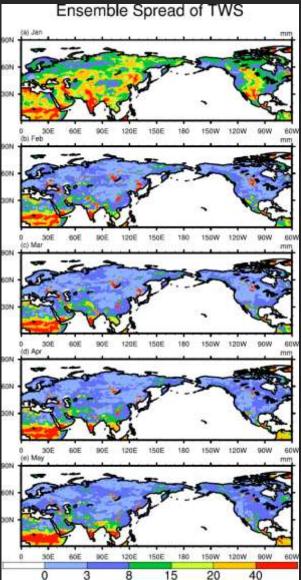
MODIS

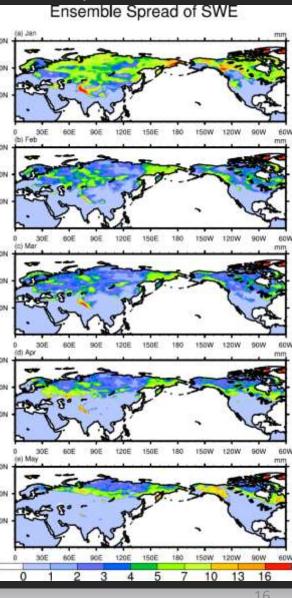
GRACE

NewSCF

#### Model uncertainty Second pass Second Second pass







**NewSCF** 

DART/CLM4

**MODIS** 

**GRACE** 

#### While MODIS data assimilation is mainly effective along the snowline, GRACE provides valuable information at higher latitudes. This is confirmed by comparing to CMC snow depth observations.

• Ensemble spread shrinks fast. The value of GRACE become small after first month's assimilation.

DART/CLM4

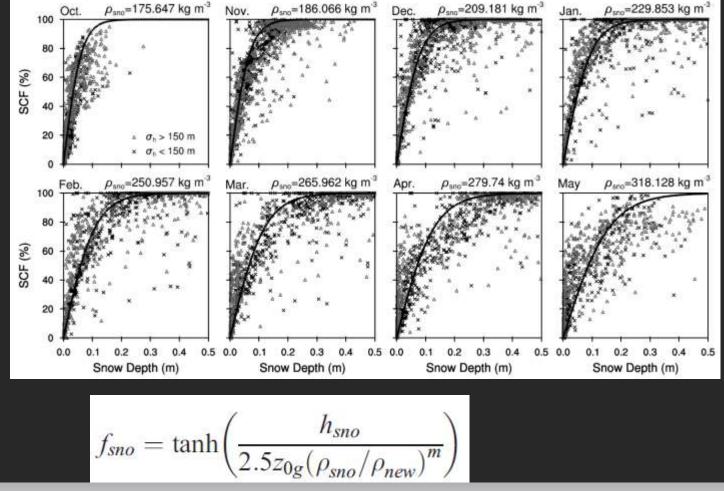
MODIS

GRACE



### SCF parameterization scheme in CLM4

#### • *Niu and Yang*, 2006 Oct. ρ<sub>sno</sub>=175.647 kg m<sup>-3</sup> Nov. ρ<sub>sno</sub>=186.066 kg m<sup>-3</sup> Dec.

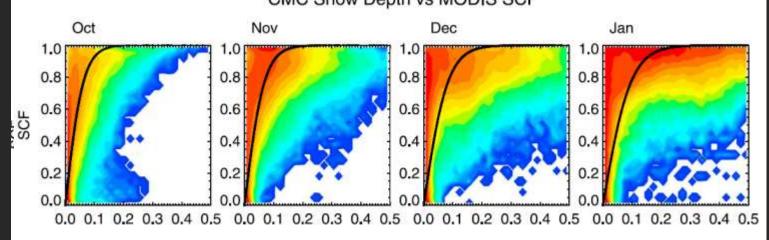


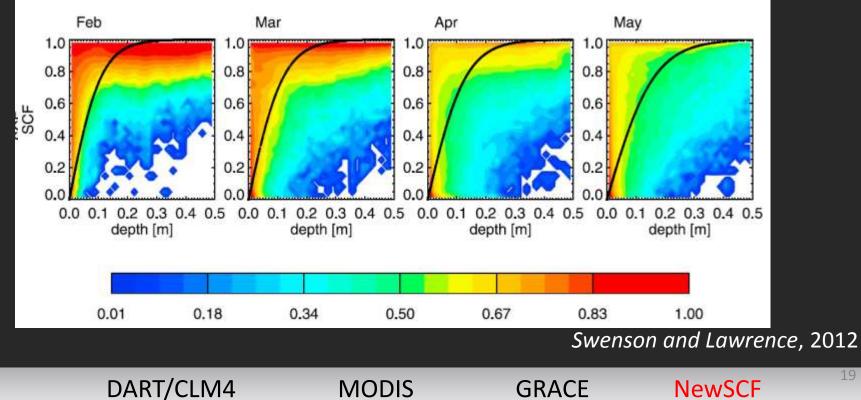
DART/CLM4

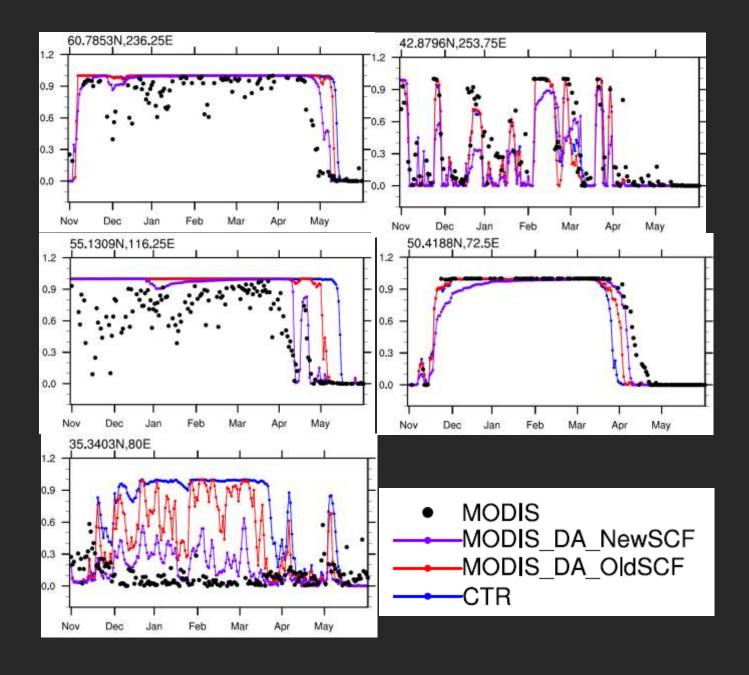
MODIS

GRACE

### Logarithm of number of grids in each bin







DART/CLM4

MODIS

GRACE

**NewSCF** 

### SCF parameterization scheme matters

 SCF Data assimilation results are very sensitive to snow cover fraction parameterization scheme

 SCF assimilation with the new SCF scheme shows better performance in the melting season, but not in the accumulation season

DART/CLM4

MODIS

GRACE



# Thanks! Questions?



