



# Adaptation of a snow cover scheme for complex topography areas: regional calibration over High Mountain Asia and application in global models

Mickaël Lalande, Martin Ménégoz, Gerhard Krinner, Catherine Ottlé

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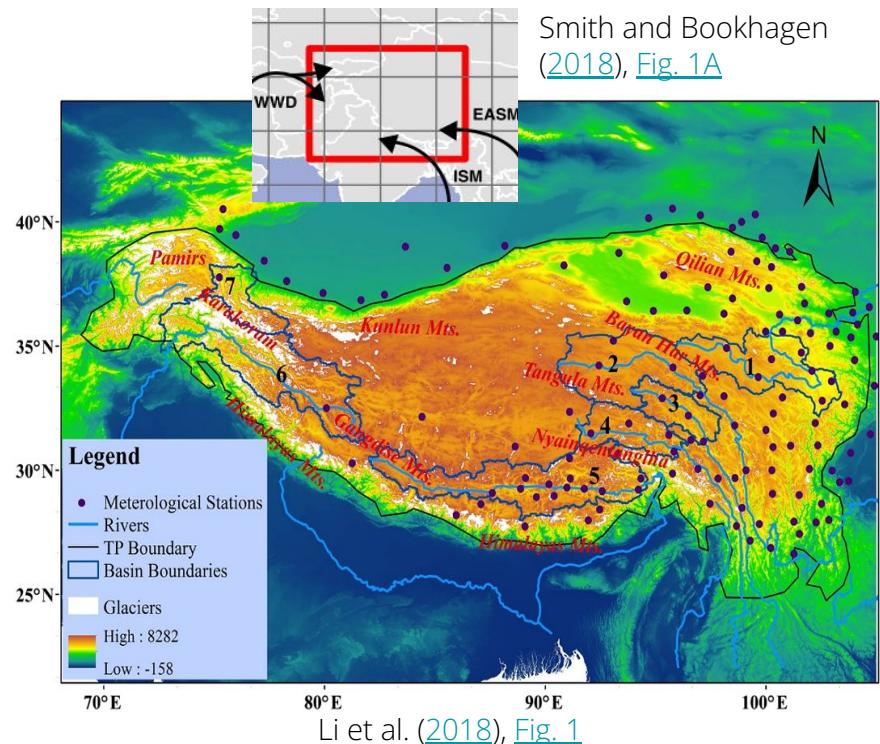
PhD Student 2019-2022

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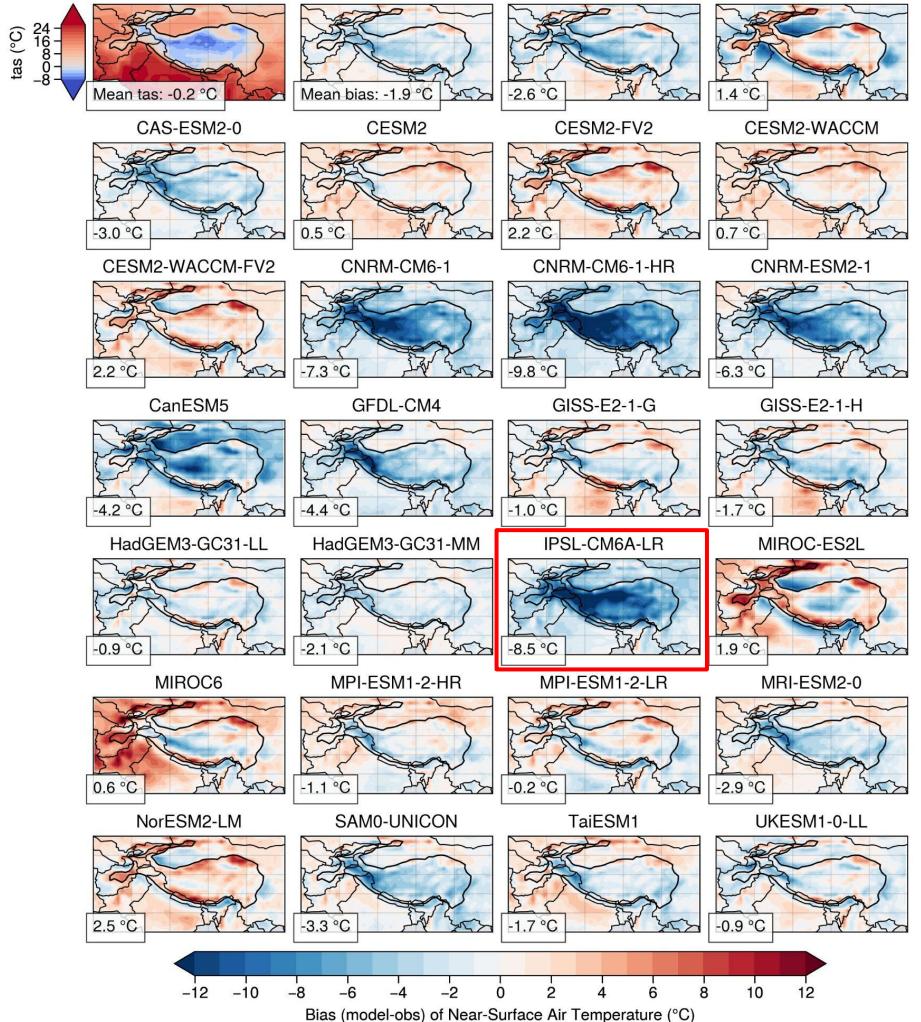
SnowHydro 2022 — 02/02/2022

# High Mountain Asia (HMA): Introduction

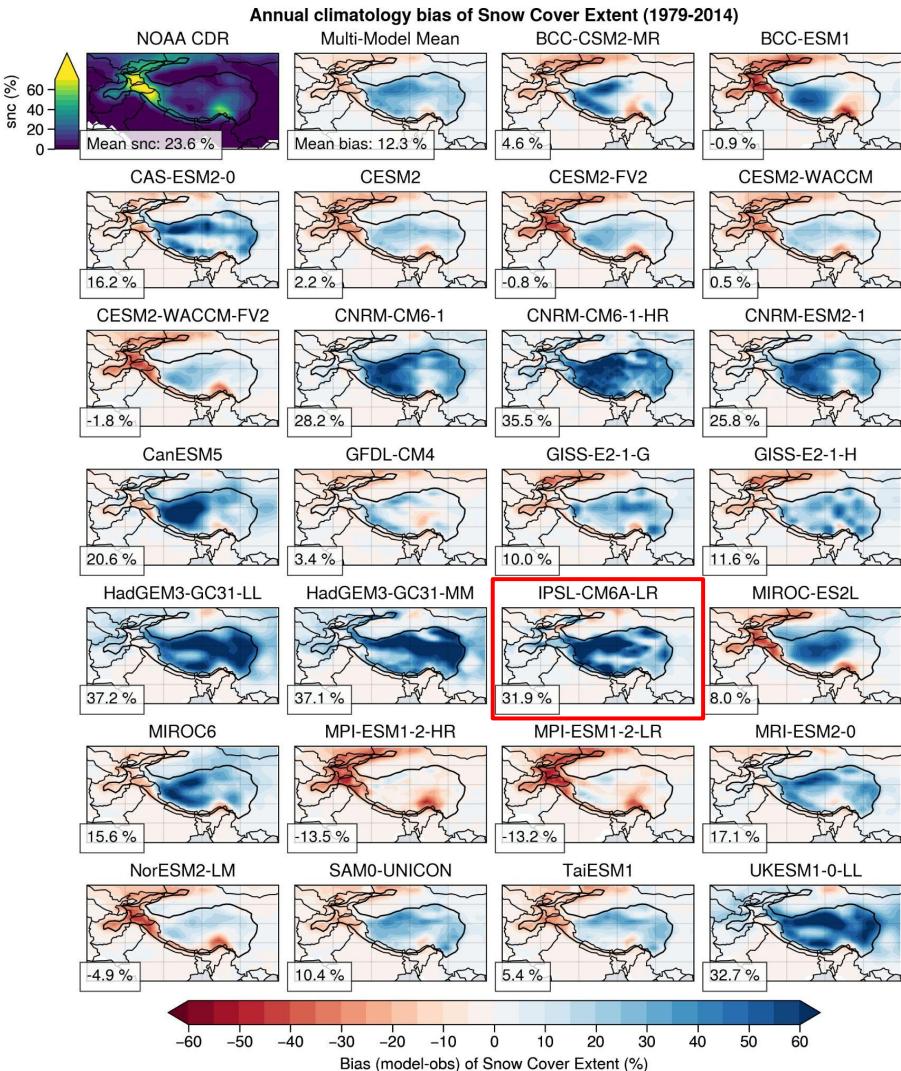
- The Tibetan Plateau (TP): **world's highest plateau** (average elevation 4000m) → influence on **regional and global climate** (e.g., Kutzbach et al., [1993](#))
- Water supply of over **1.4 billion** living downstream (e.g. Immerzeel et al., [2012](#))
- Climatic regimes:
  - winter **westerly disturbances** (WDs)
  - Indian / East Asian **summer monsoon**
- **Warming** over the HMA and TP (Liu et al., [2000](#); Wang et al., [2008](#)) -> **impacts** on permafrost (Yang et al., [2010](#)), glaciers (Yao et al., [2007](#)), water resources (e.g. Immerzeel et al., [2010](#)), etc.



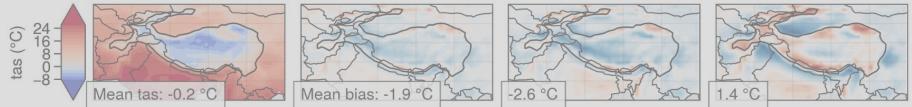
### Annual climatology bias of Near-Surface Air Temperature (1979-2014)



### Annual climatology bias of Snow Cover Extent (1979-2014)



### Annual climatology bias of Near-Surface Air Temperature (1979-2014)



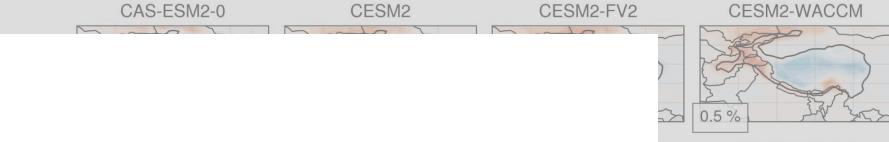
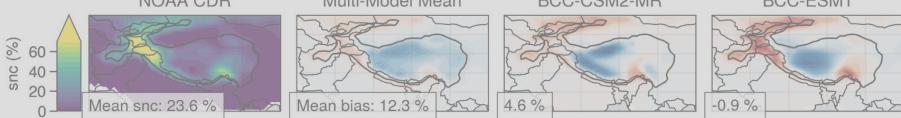
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CESM2-FV2  
CESM2-WACCM  
CESM2-WACCM-FV2  
CanESM5  
HadGEM3-GC31-LL  
MIROC6  
NorESM2-LM

Earth Syst. Dynam., 12, 1061–1098, 2021  
<https://doi.org/10.5194/esd-12-1061-2021>  
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Research article

### Annual climatology bias of Snow Cover Extent (1979-2014)



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# Climate change in the High Mountain Asia in CMIP6

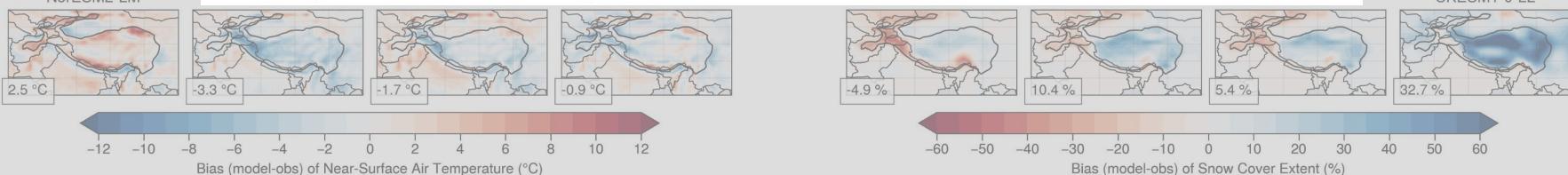
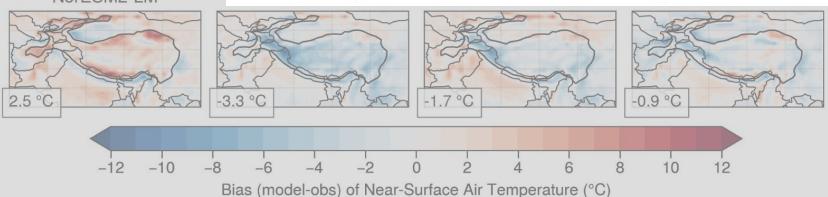
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Received: 16 Jun 2021 – Discussion started: 24 Jun 2021 – Accepted: 23 Aug 2021 – Published: 02 Nov 2021

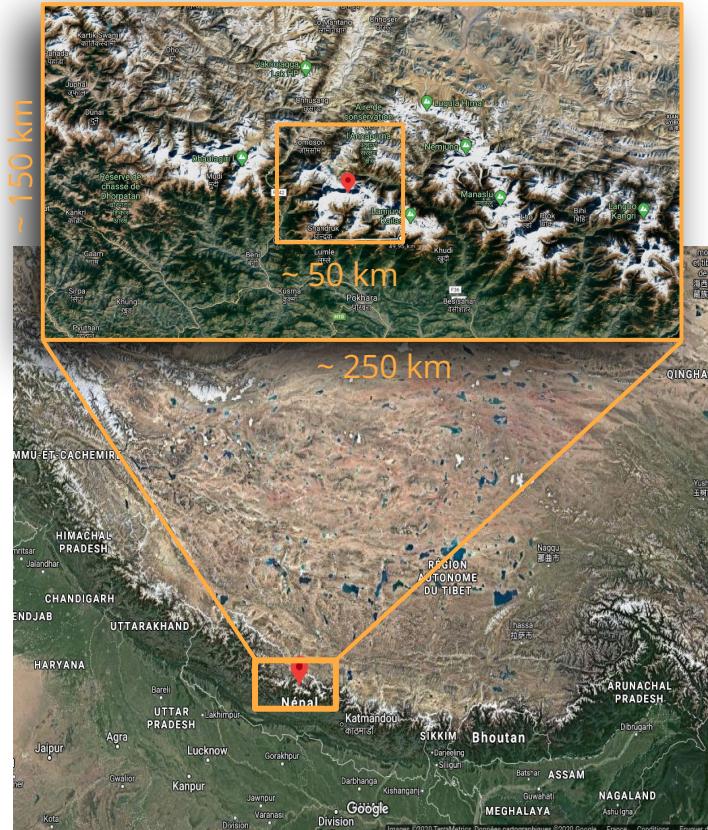


# Snow cover parameterization in global models

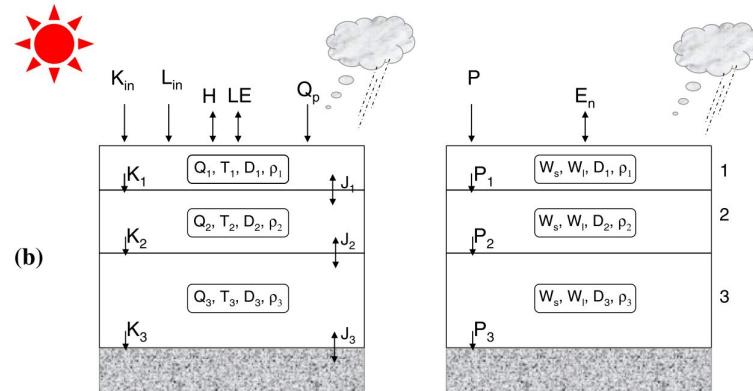


IPSL-CM6A

# Snow cover parameterization in global models



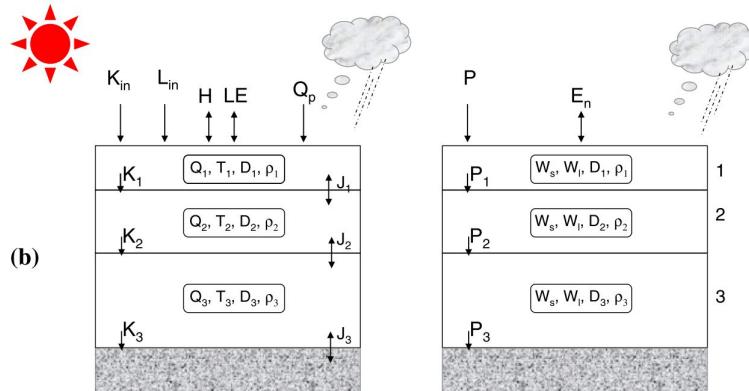
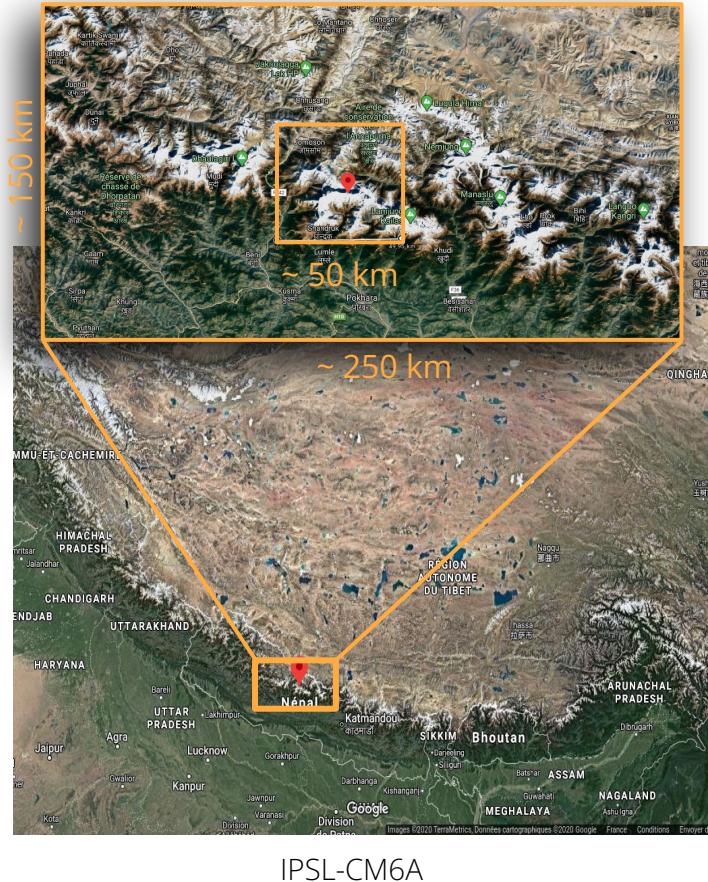
IPSL-CM6A



$K_{in}$  (short wave radiation),  $L_{in}$  (longwave radiation),  $H$  (sensible heat flux),  $LE$  (latent heat flux),  $J$  (conduction heat flux),  $Q$  (snow layer heat content),  $Q_p$  (advection heat from rain and snow),  $W$  (snow layer SWE),  $W_l$  (snow layer liquid water content),  $D$  (snow layer depth),  $\rho$  (snow layer density),  $P$  (precipitation),  $E_n$  (evaporation)

snow scheme in the ORCHIDEE land surface model  
(Wang et al., [2013](#))

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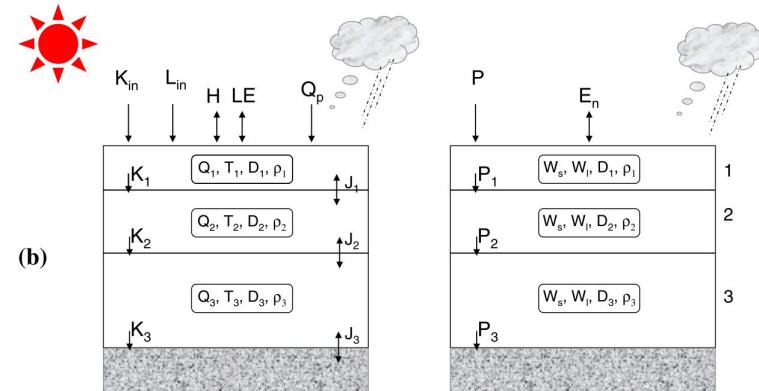
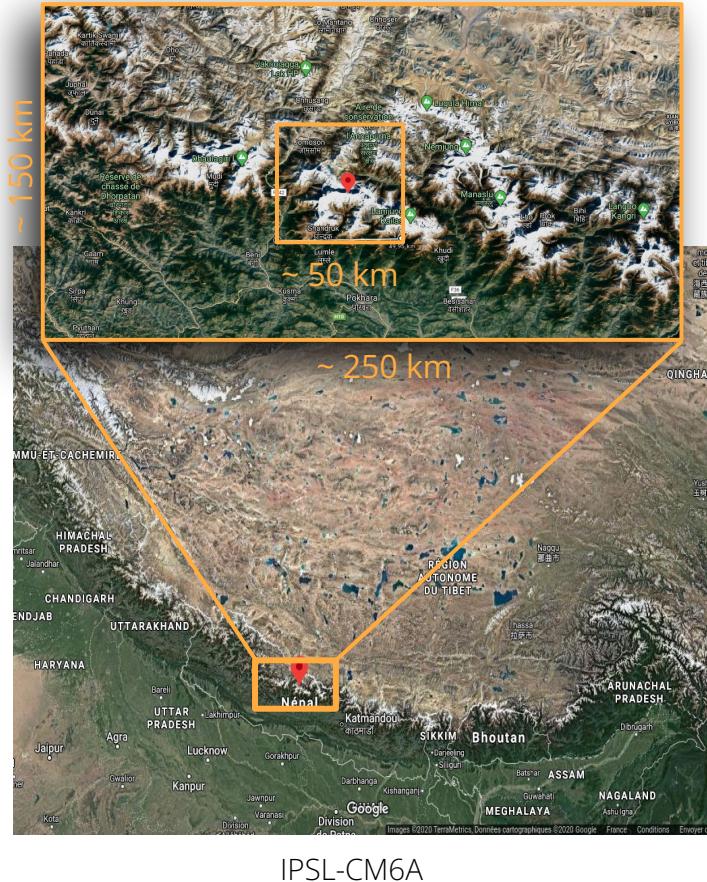


Snow Depth

Snow Water Equivalent

Snow Density

# Snow cover parameterization in global models



$K_{in}$  (short wave radiation),  $L_{in}$  (longwave radiation),  $H$  (sensible heat flux),  $LE$  (latent heat flux),  $J$  (conduction heat flux),  $Q$  (snow layer heat content),  $Q_p$  (advection from rain and snow),  $W$  (snow layer SWE),  $W_l$  (snow layer liquid water content),  $D$  (snow layer depth),  $\rho$  (snow layer density),  $P$  (precipitation),  $E_n$  (evaporation)

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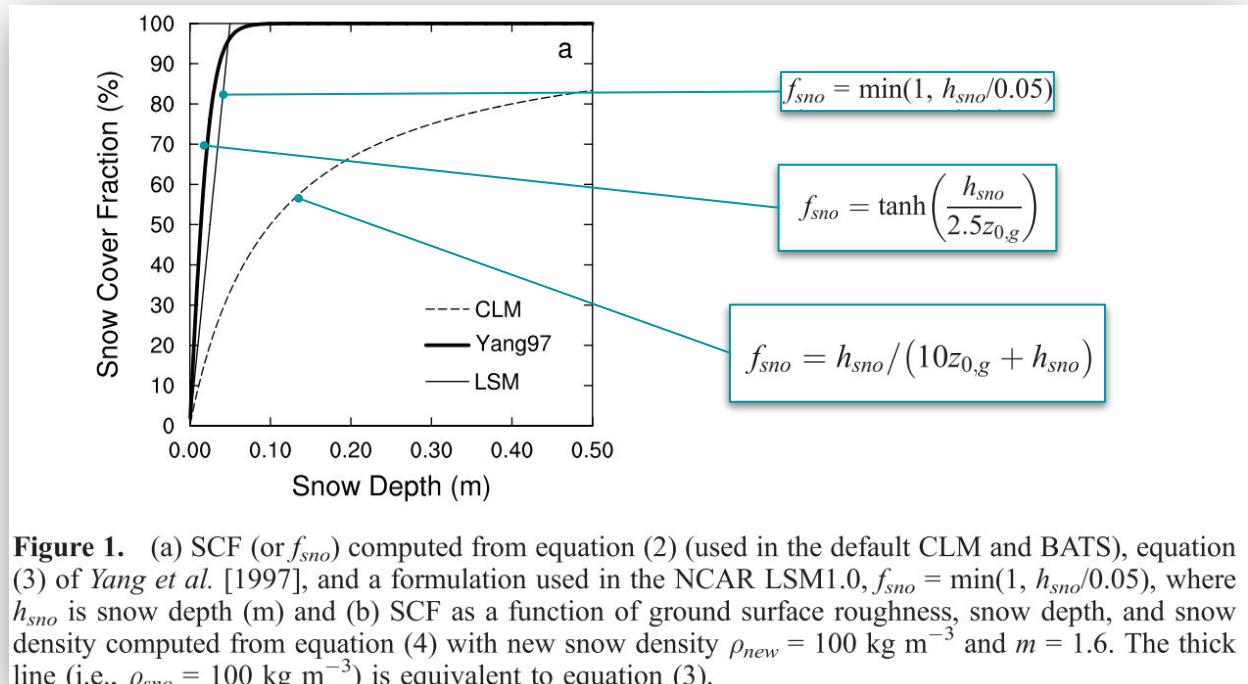
Snow Water Equivalent



Snow Cover Fraction

Snow Density

# Snow cover real world vs global models



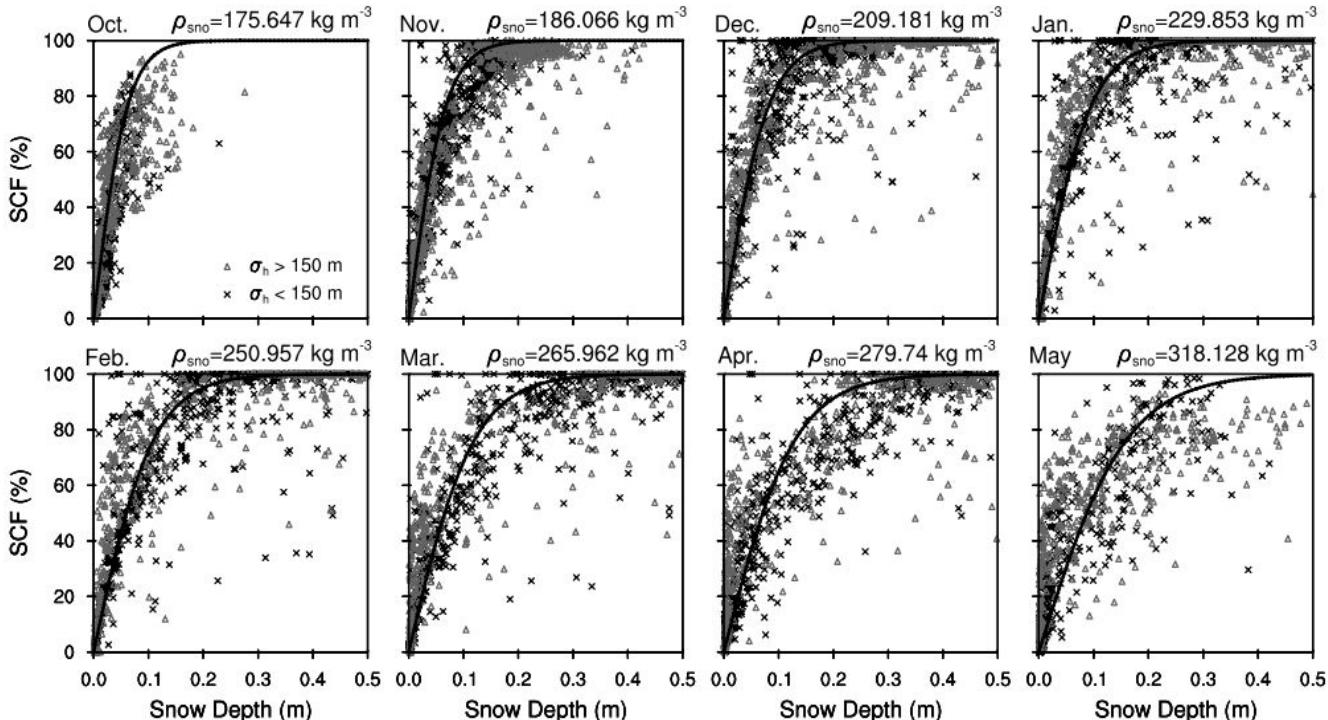
Niu and Yang ([2007](#))

# Snow Cover parameterization: Niu and Yang (2007)

$$f_{sno} = \tanh\left(\frac{h_{sno}}{2.5z_0g(\rho_{sno}/\rho_{new})^m}\right)$$



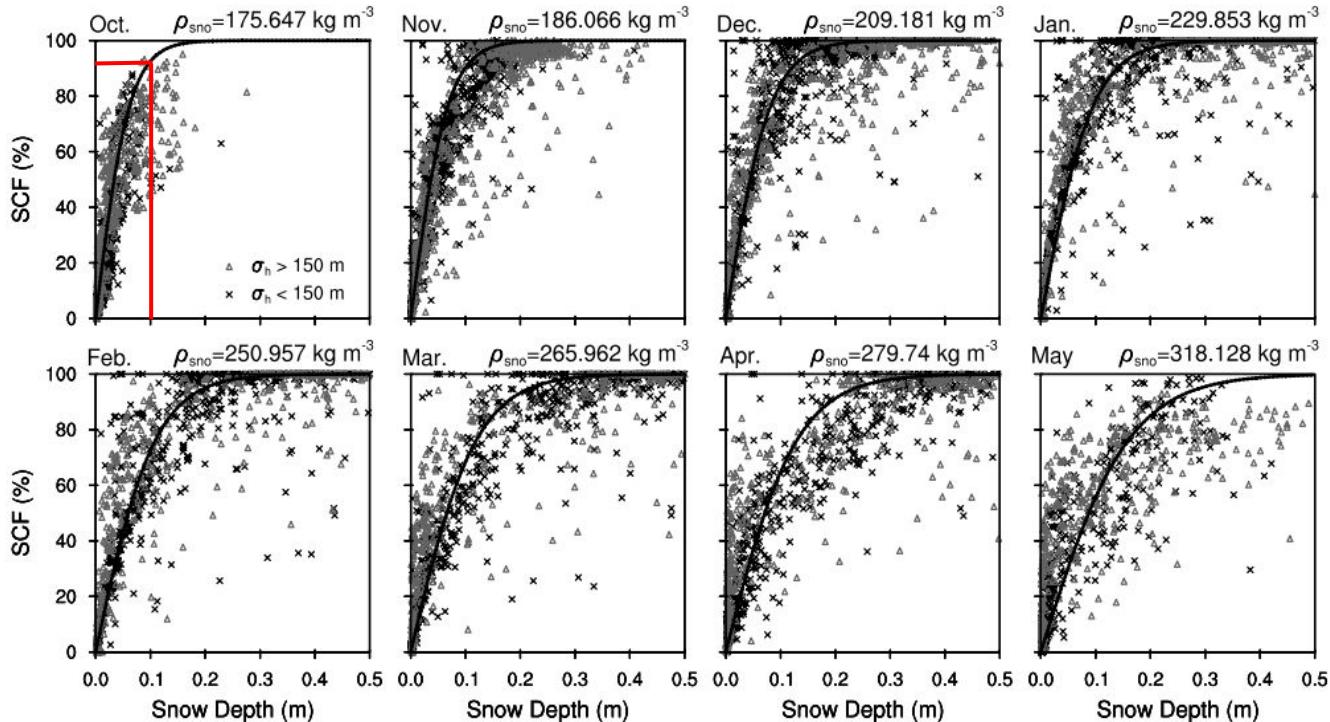
**Snow Density**



**Figure 2.** Relationship between AVHRR SCF (%) and CMC snow depth (m) in  $1^\circ \times 1^\circ$  grid cells of major NA river basins including the Mackenzie, Yukon, Churchill, Fraser, St. Lawrence, Columbia, Colorado, and Mississippi from October to May. The darker crosses stand for  $1^\circ \times 1^\circ$  grid cells where the standard deviation of topography  $\sigma_h < 150 \text{ m}$ , and the lighter triangles stand for  $1^\circ \times 1^\circ$  grid cells where  $\sigma_h > 150 \text{ m}$ . The fitted lines are computed from equation (4) ( $m = 1.6$ ) with the mean snow densities shown above each frame.

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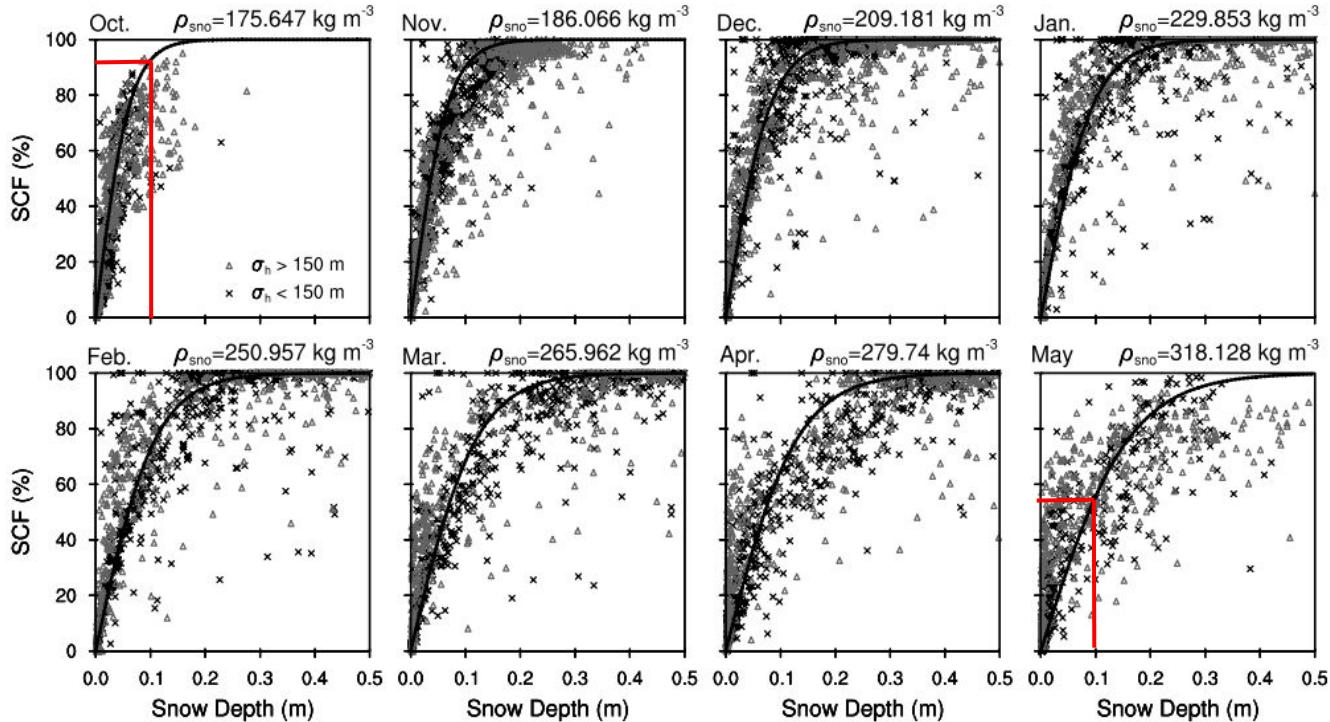
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# Snow Cover parameterization: Niu and Yang (2007) - NY07

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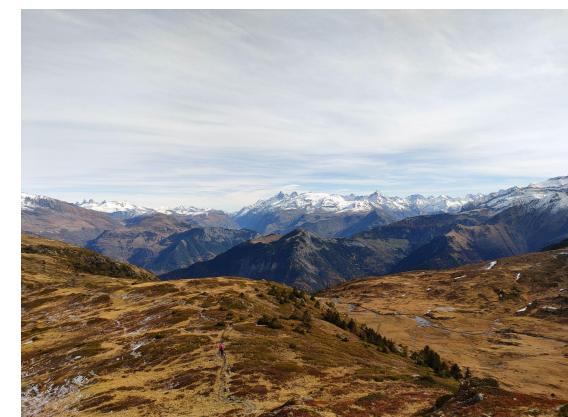


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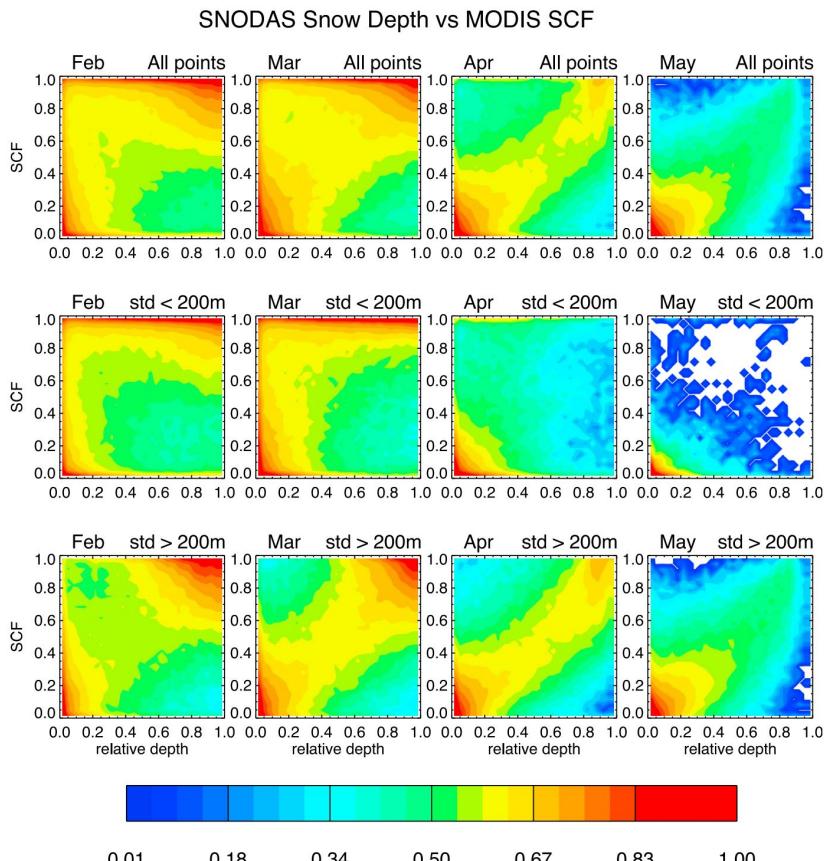
## Snow cover micro to macro



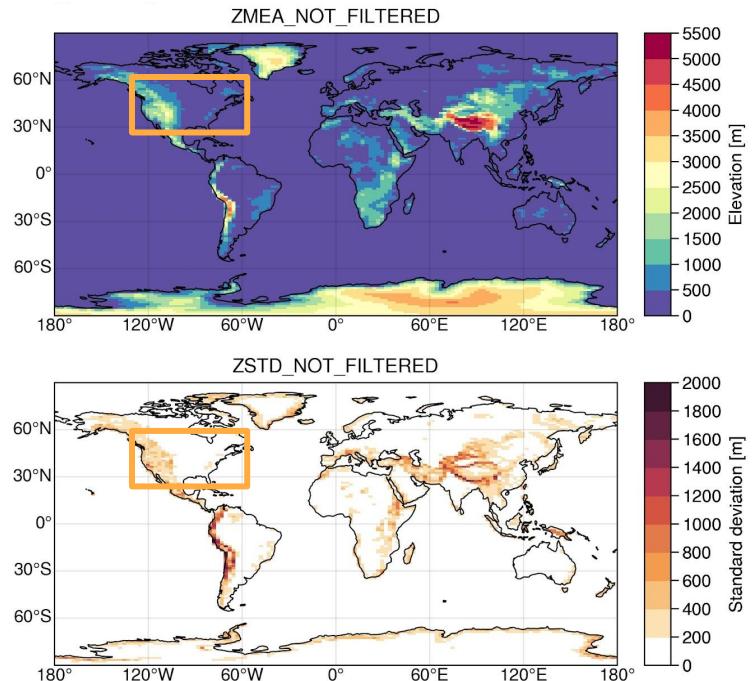
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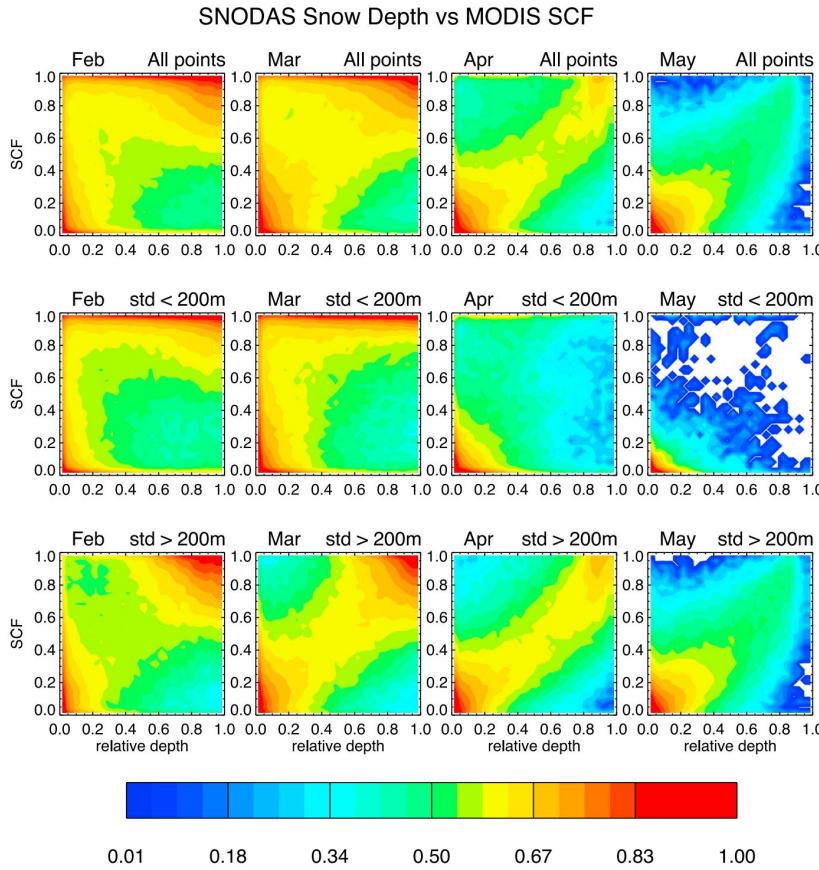
# Snow cover in mountainous area: Swenson & Lawrence (2012) - SL12



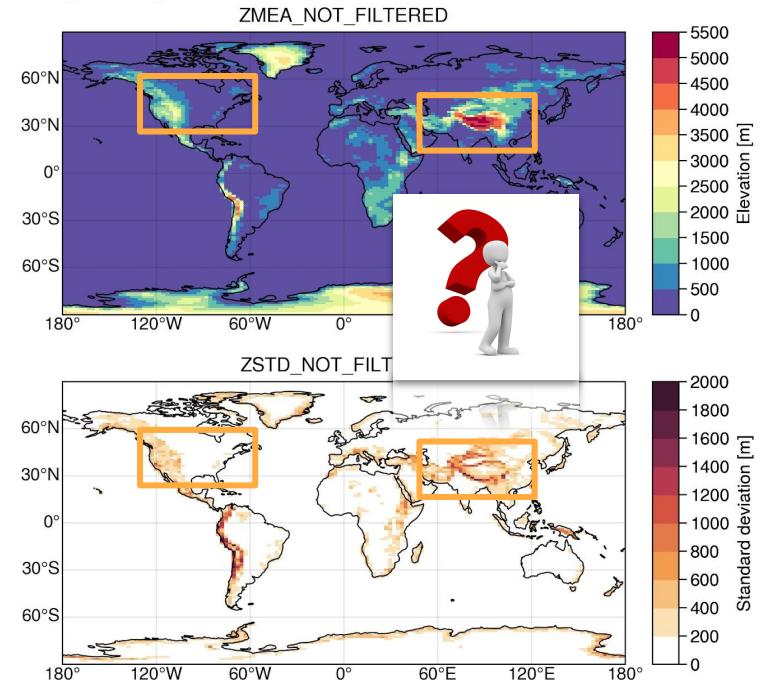
Swenson & Lawrence (2012)



# Snow cover in mountainous area: Swenson & Lawrence (2012)



Swenson & Lawrence (2012)



# High Mountain Asia UCLA Daily Snow Reanalysis ([HMASR](#))

- **Problem:**

- No global reliable product of SD/SWE over mountainous areas
- To better test/calibrate SCF param -> need SD and SWE (or density)

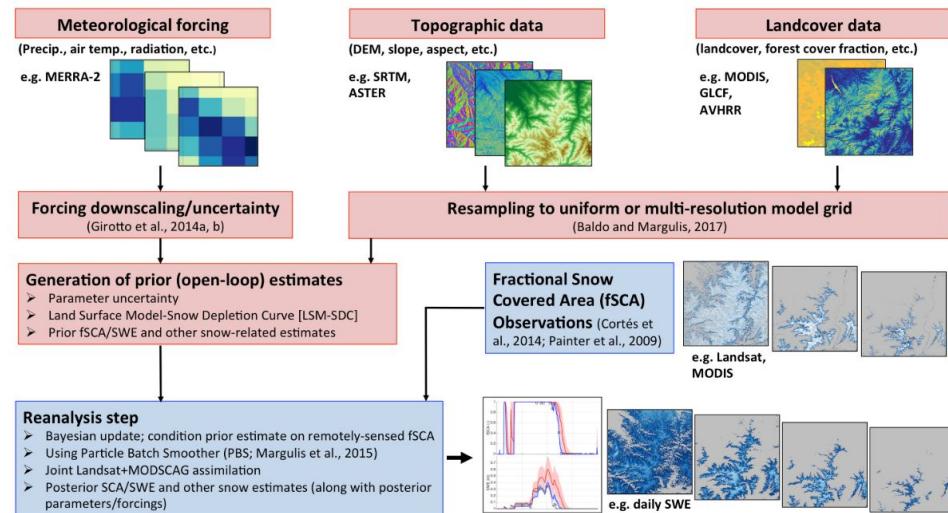
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- **Problem:**

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- To better test/calibrate SCF param -> need SD and SWE (or density)

- **New snow reanalysis over HMA: [HMASR](#)**

- downscale meteorological forcing + topo/landcover -> prior SCF/SWE
- assimilate Landsat/MODIS -> posterior SCF/SWE
- provides daily SCF/SWE at 500 m
- not validated over HMA / Sierra Nevada (Margulis et al., [2016](#)) and Andes (Cortés and Margulis, [2017](#))



**FIGURE 2 |** Schematic representation of the Bayesian snow reanalysis framework that consists of an ensemble-based prior modeling system (red boxes) and posterior update component for assimilating remotely sensed fractional snow covered area (SCA) data from Landsat and MODIS.

Margulis et al. ([2019](#))

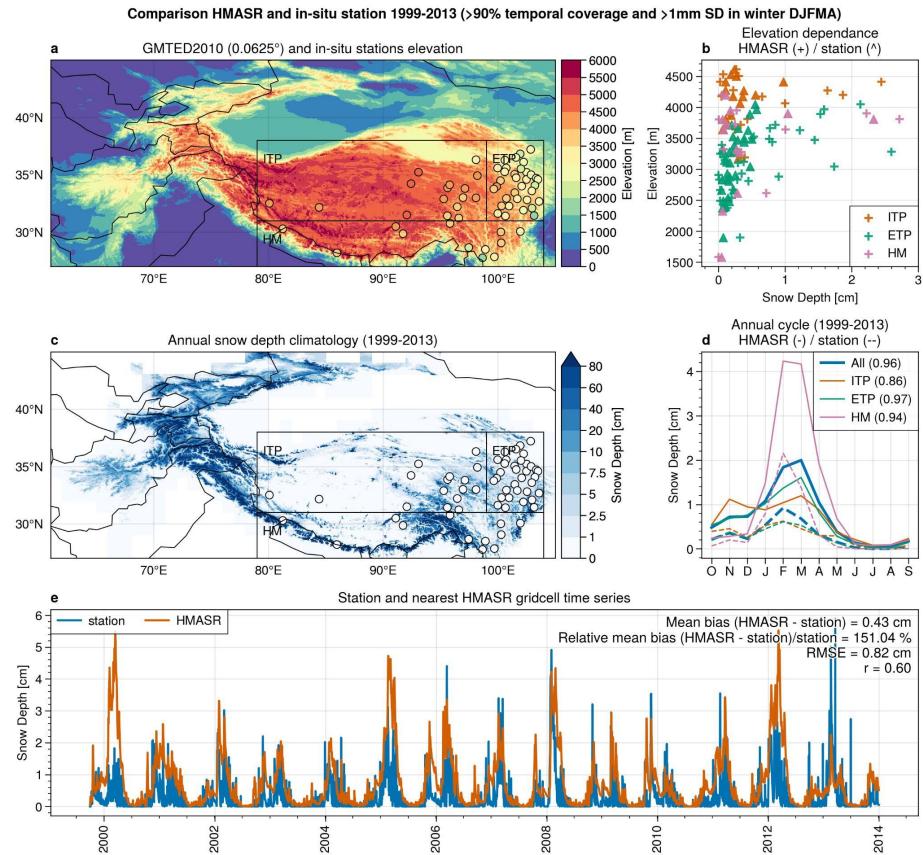
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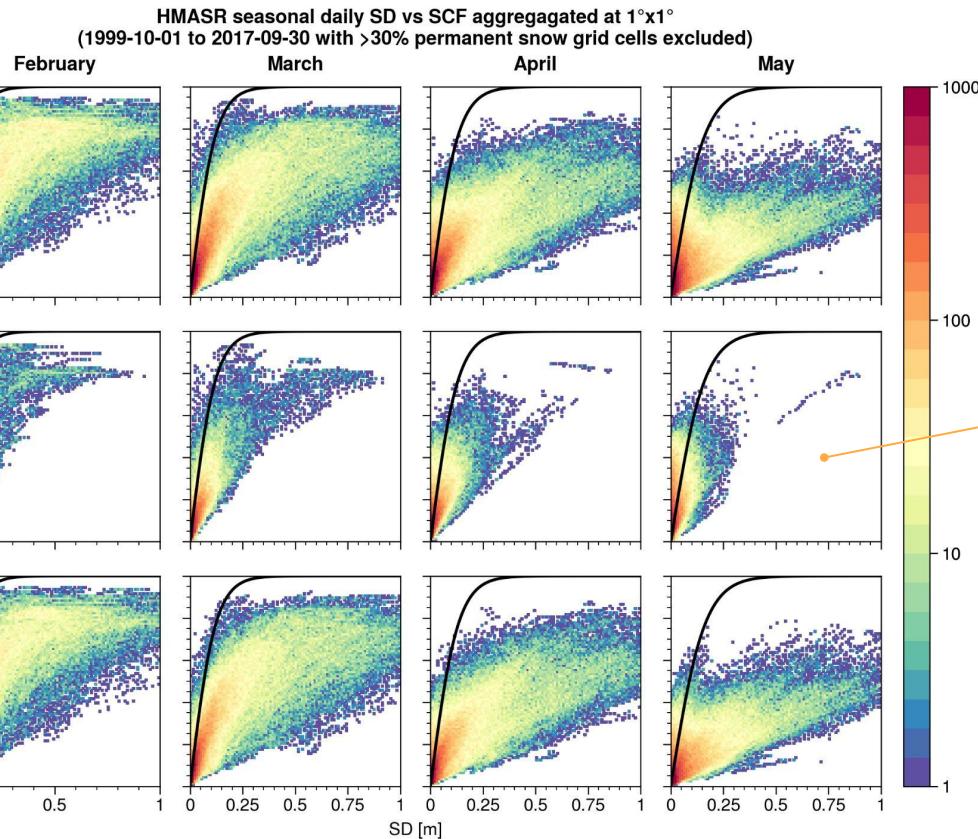
- **New snow reanalysis over HMA: [HMASR](#)**

- validation with in-situ [SD stations](#)
  - time series correlation: 0.6
  - overestimation of SD
  - reproduce annual cycles
- permanent snow not reliable -> use only seasonal snow



# Snow cover in mountainous area: HMASR

$$f_{sno} = \tanh\left(\frac{h_{sno}}{2.5z_0g(\rho_{sno}/\rho_{new})^m}\right)$$



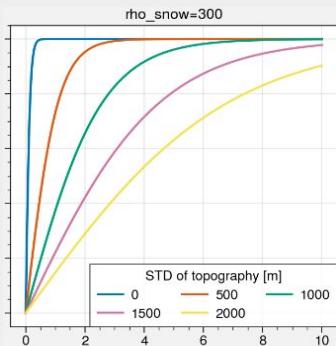
HMASR might be not representative of flat areas (TP mostly have STD >200m and dry)

# Other snow cover parameterizations

Niu and Yang (2007) custom

$$F = \tanh\left(\frac{d}{2.5z_0g(\rho_{snow}/\rho_{new})^m}\right)$$

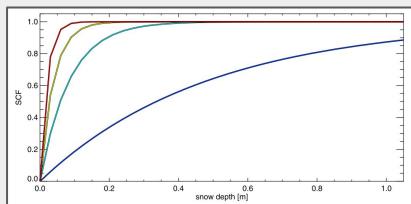
STD topo



Swenson and Lawrence (2012)

Accumulation

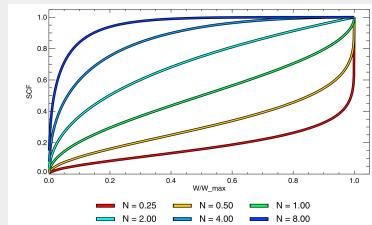
$$F_{N+1} = 1 - (p_{N+1})(p_N) = 1 - (1 - s_{N+1})(1 - F_N)$$



Depletion

$$F = 1 - \left[ \frac{1}{\pi} \arccos\left( 2 \frac{W}{W_{max}} - 1 \right) \right]^{N_{melt}}$$

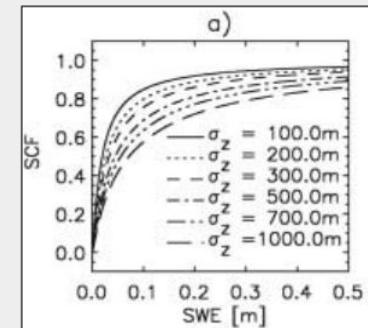
$$N_{melt} = \frac{200}{\sigma_{topo}}$$



Roesch et al. (2001)

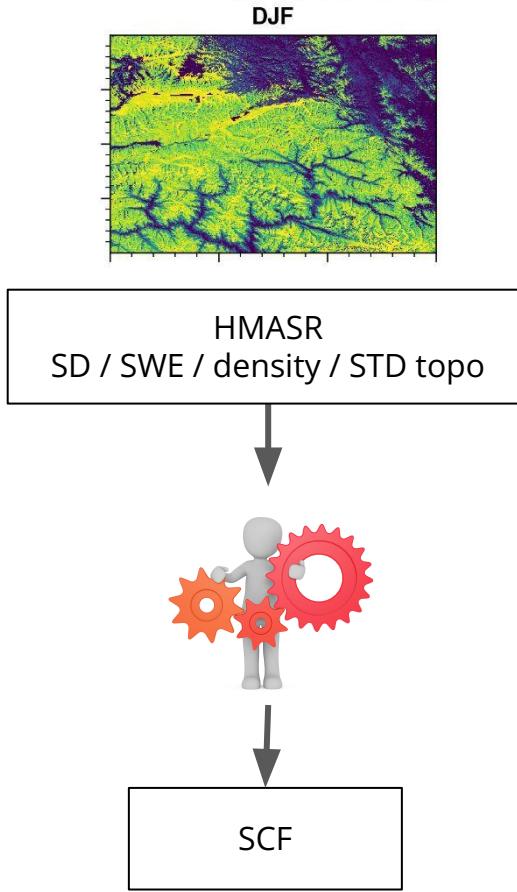
Mountainous areas

$$f_s = 0.95 \cdot \tanh(100 \cdot S_n) \sqrt{\frac{1000 \cdot S_n}{1000 \cdot S_n + \epsilon + 0.15\sigma_z}}$$

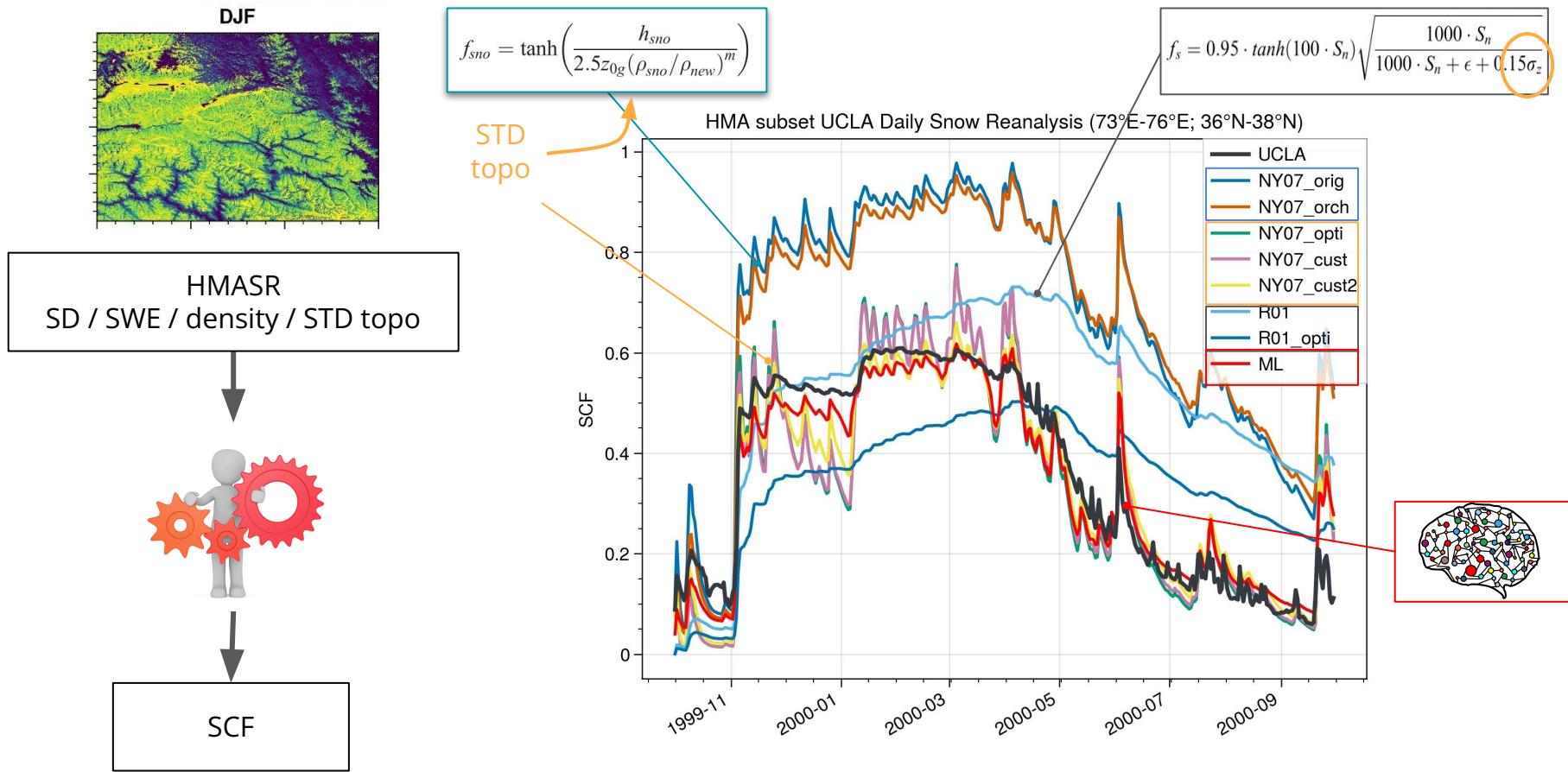


Depends only on SWE so no hysteresis

# Preliminary test and calibration over small area

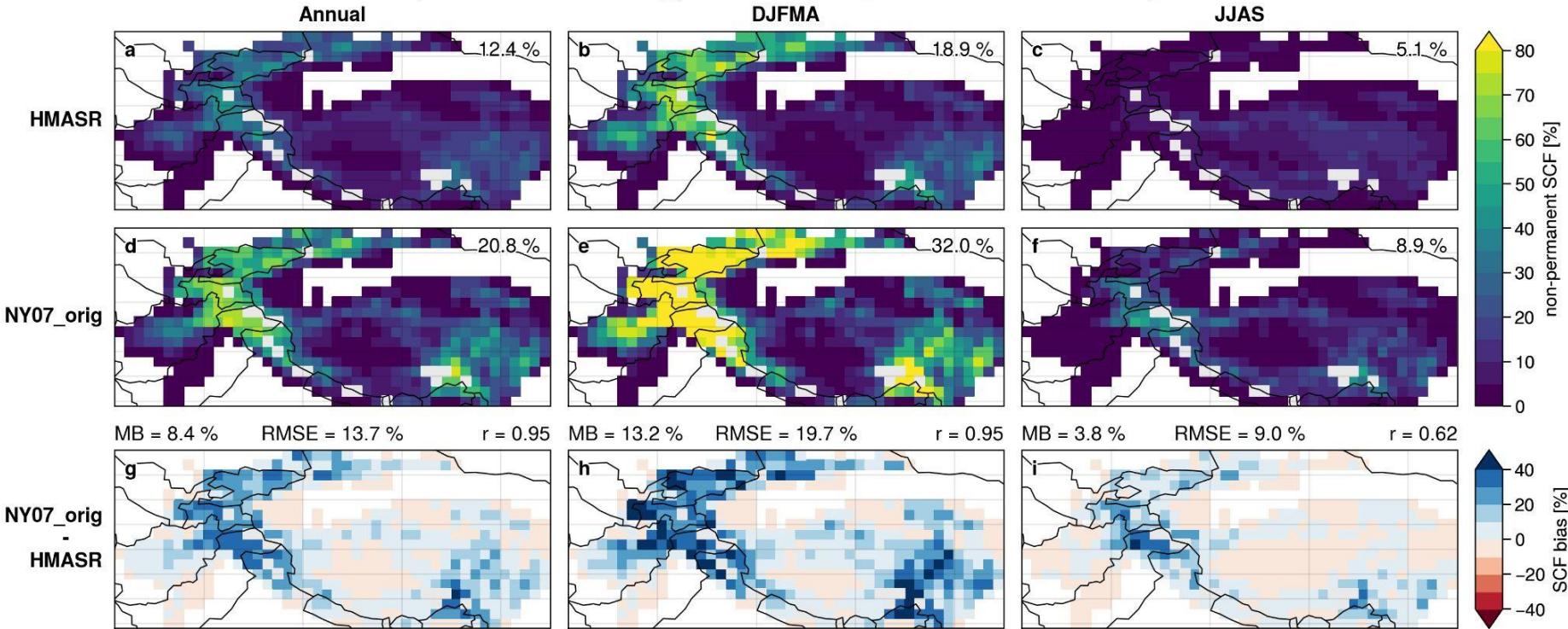


# Preliminary test and calibration over small area



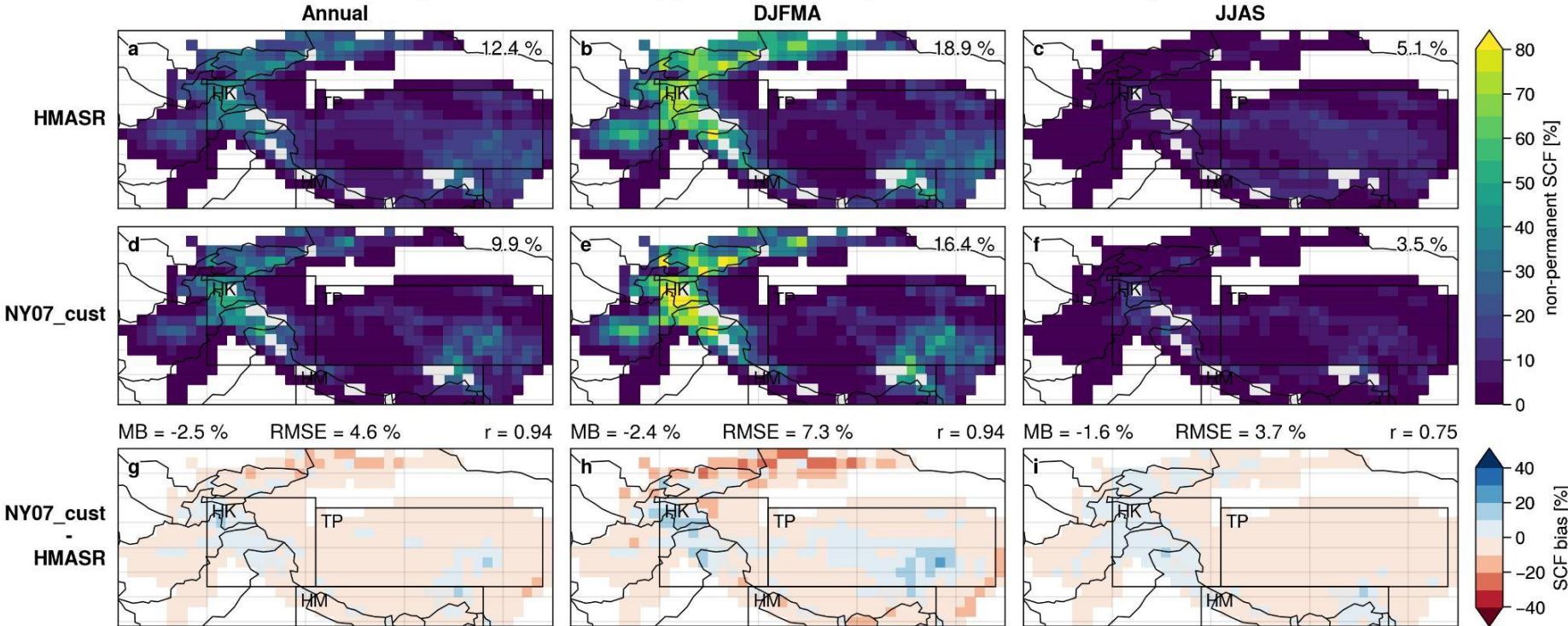
# Calibration

NY07\_orig daily non-permanent SCF at  $1^\circ \times 1^\circ$  predicted from HMASR inputs  
(1999-10-01 to 2017-09-30; grid cells with >30% permanent snow are excluded)

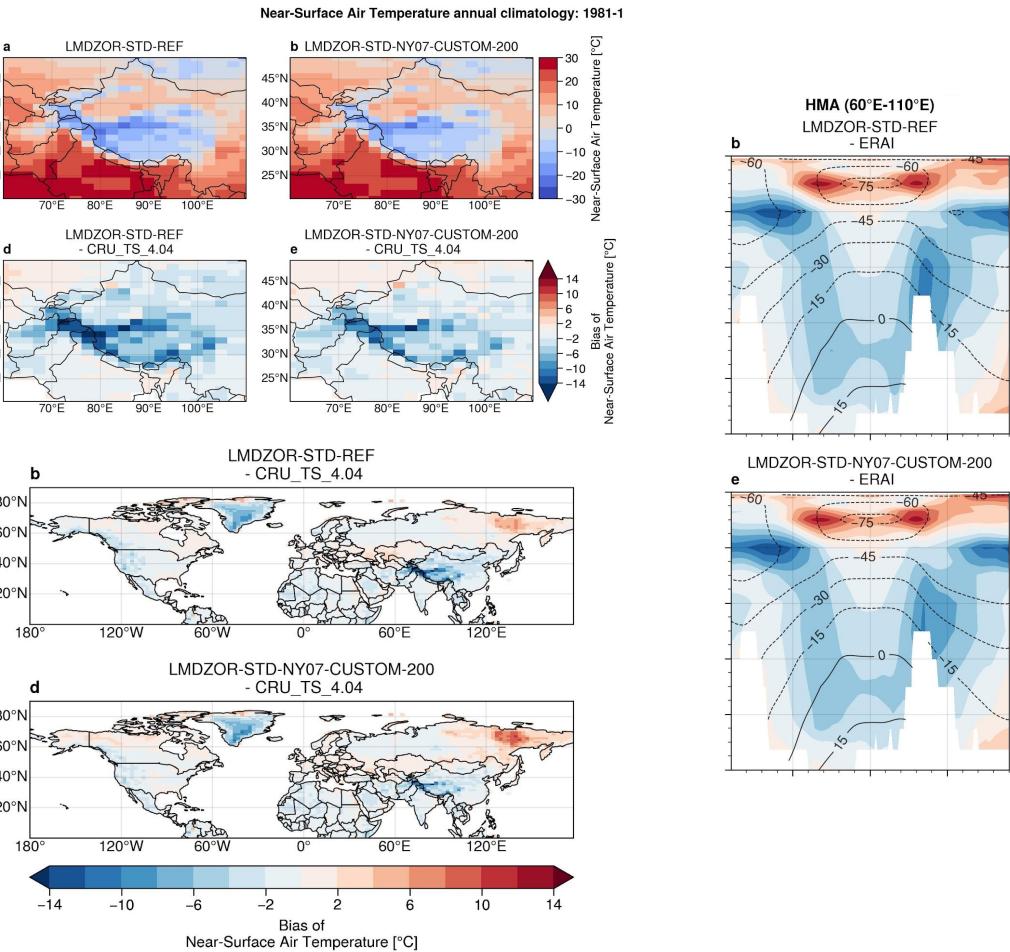
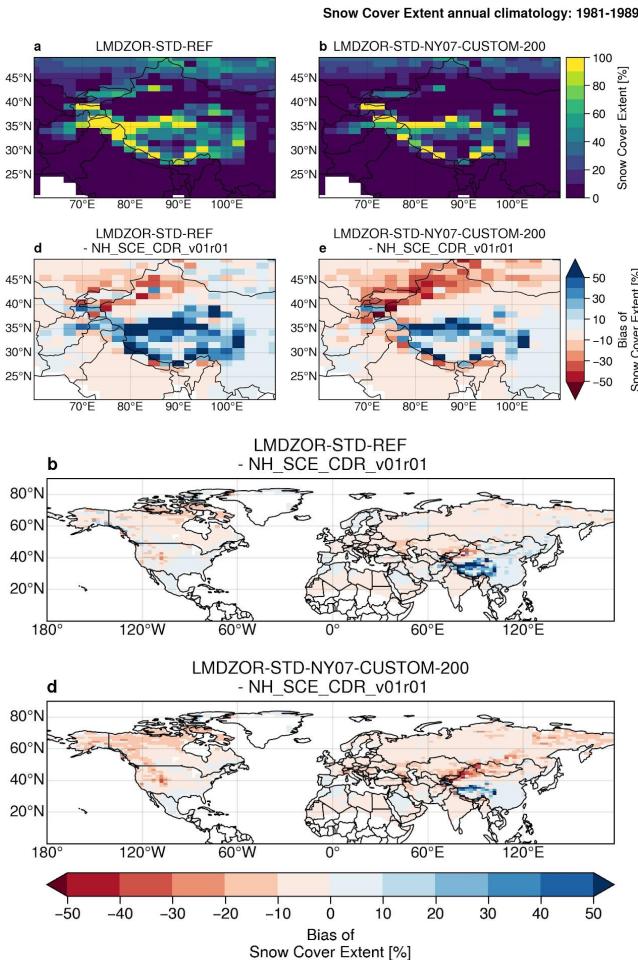


# Calibration

NY07\_cust daily non-permanent SCF at  $1^\circ \times 1^\circ$  predicted from HMASR inputs  
 (1999-10-01 to 2017-09-30; grid cells with >30% permanent snow are excluded)



# Niu and Yang (2007) custom



## Perspectives / Discussion / Conclusion

- Finish to test SL12, R01, and ML over the whole HMA domain
- Test the sensitivity of the optimizations to the resolution (25, 50 and 100 km)
- Make simulation in ORCHIDEE with calibrated NY07\_cust (+ nudged + zoom?)
- Not expected to fully solve the cold bias over HMA in ORCHIDEE:
  - precipitation (orographic drag; e.g, Wang et al., [2020](#)) / aerosol deposition on snow (e.g., Usha et al., [2020](#)) / boundary layer (e.g., Serafin et al., [2020](#)) / tropospheric cold bias, etc.
- HMA not representative of flat areas (best would be to include other dataset from other areas)
- Permanent snow area could cause problem (-> accumulation/melt of snow over very small area -> glaciers)
  - elevation bands (e.g., Walland and Simmonds, [1996](#); Younas et al., [2017](#))
- Other parameterizations not tested, e.g.: Liston ([2004](#)), Helbig et al. ([2021](#)), etc.
- Deep learning very promising for these kind of parameterization

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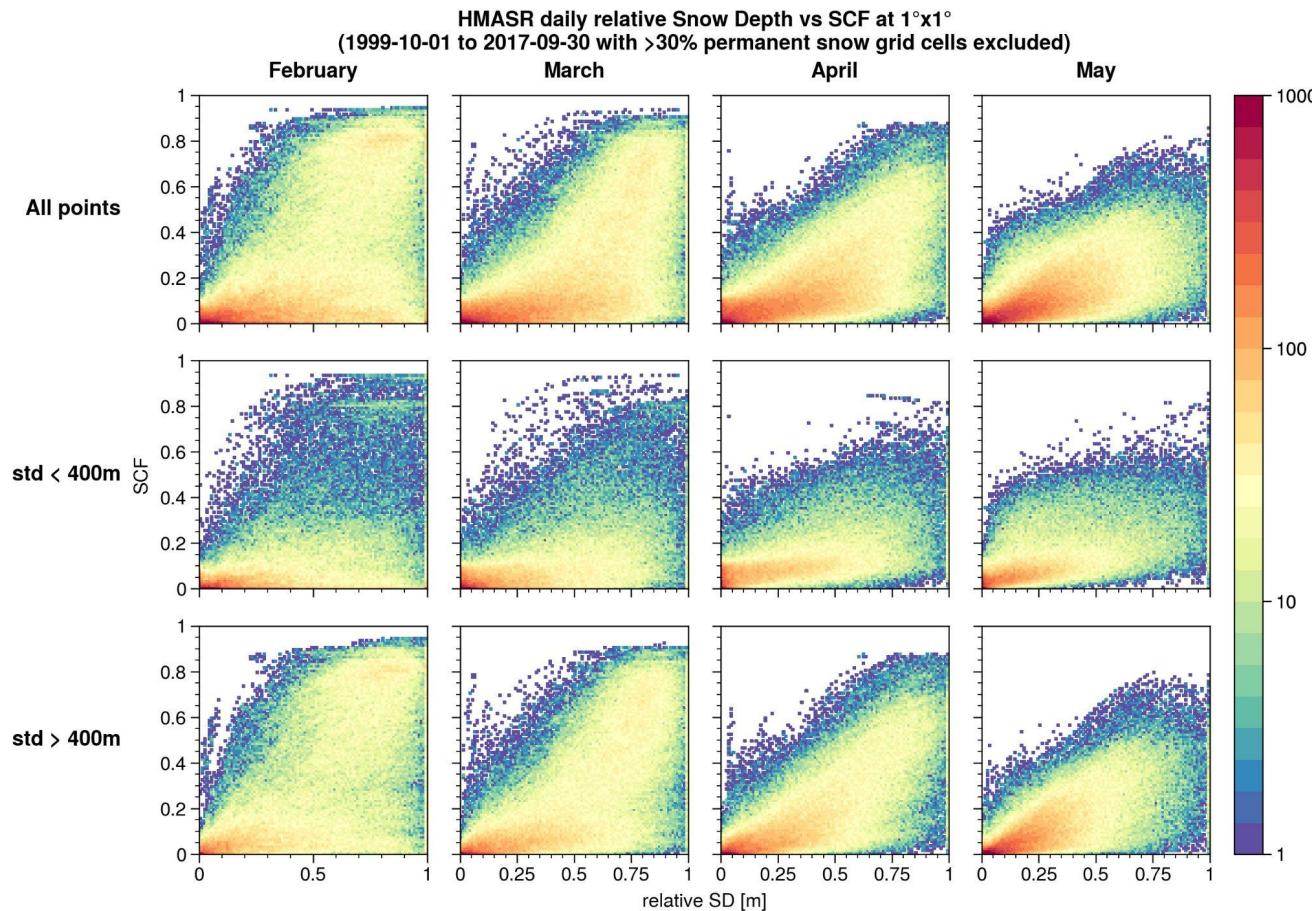
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## Complementary Slides

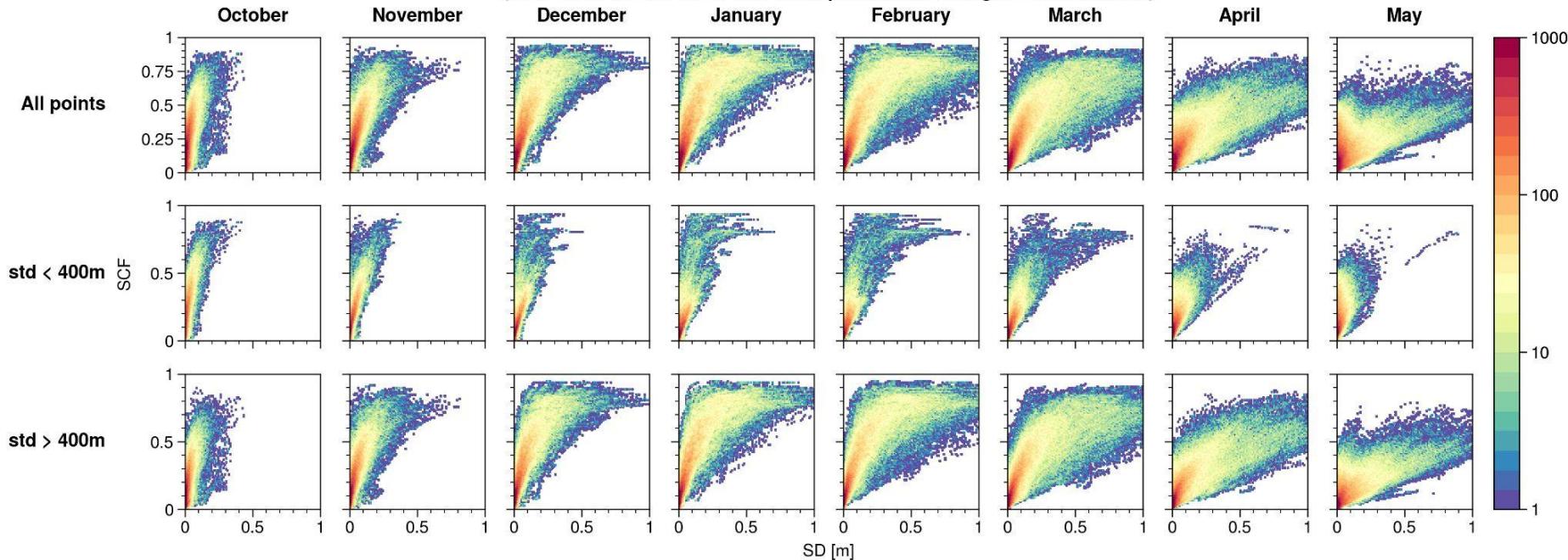
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# High Mountain Asia UCLA Daily Snow Reanalysis



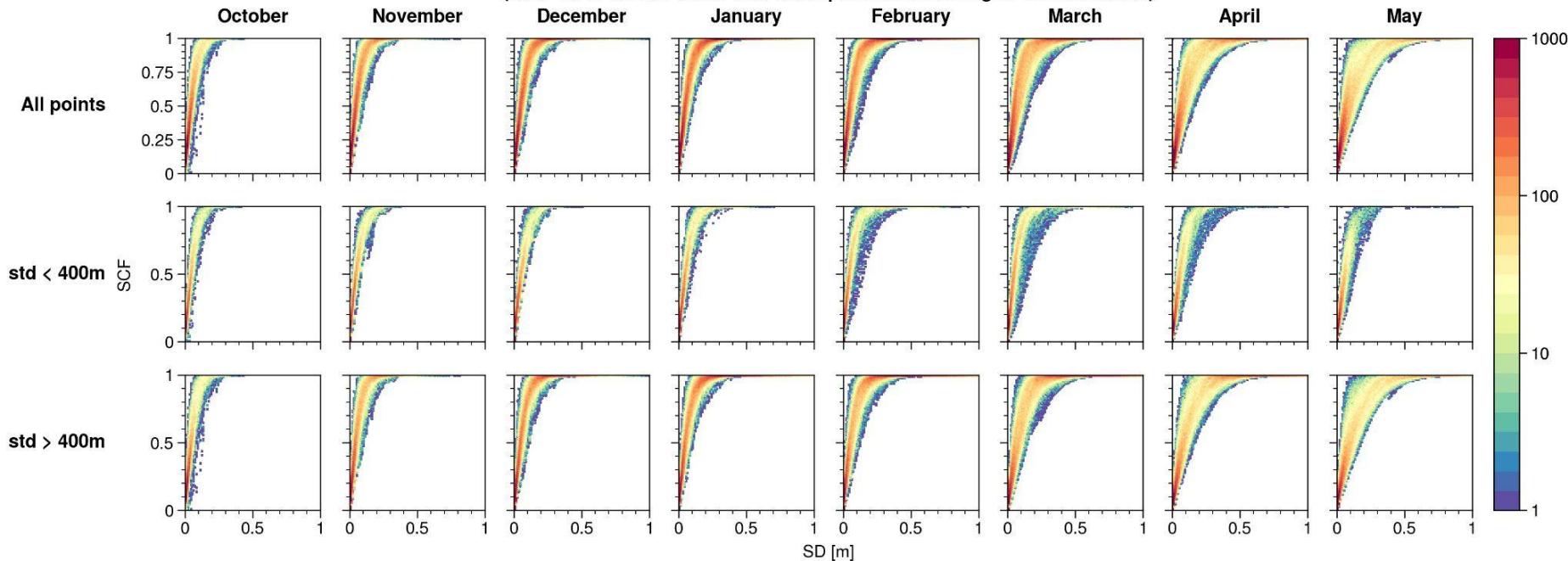
# High Mountain Asia UCLA Daily Snow Reanalysis

HMASR non-permanent daily SCF vs HMASR SD at  $1^\circ \times 1^\circ$   
(1999-10-01 to 2017-09-30 with >30% permanent snow grid cells excluded)



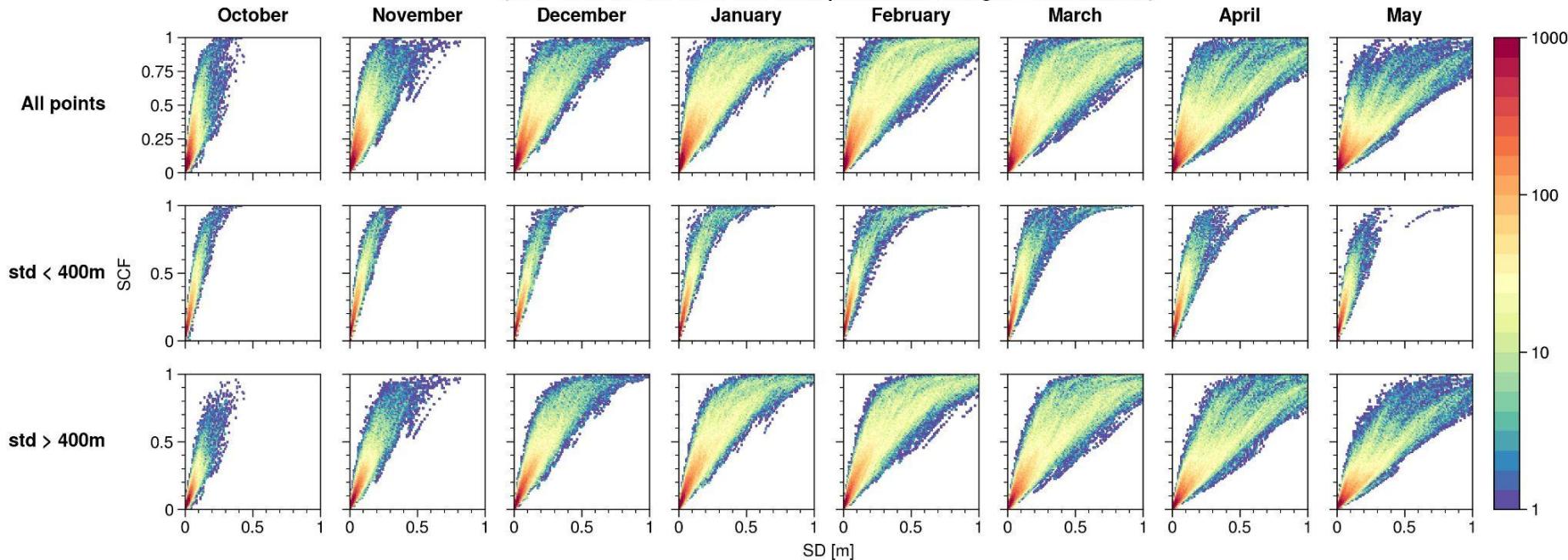
# High Mountain Asia UCLA Daily Snow Reanalysis

NY07\_orig non-permanent daily SCF (predicted from HMASR inputs) vs HMASR SD at  $1^\circ \times 1^\circ$   
(1999-10-01 to 2017-09-30 with >30% permanent snow grid cells excluded)

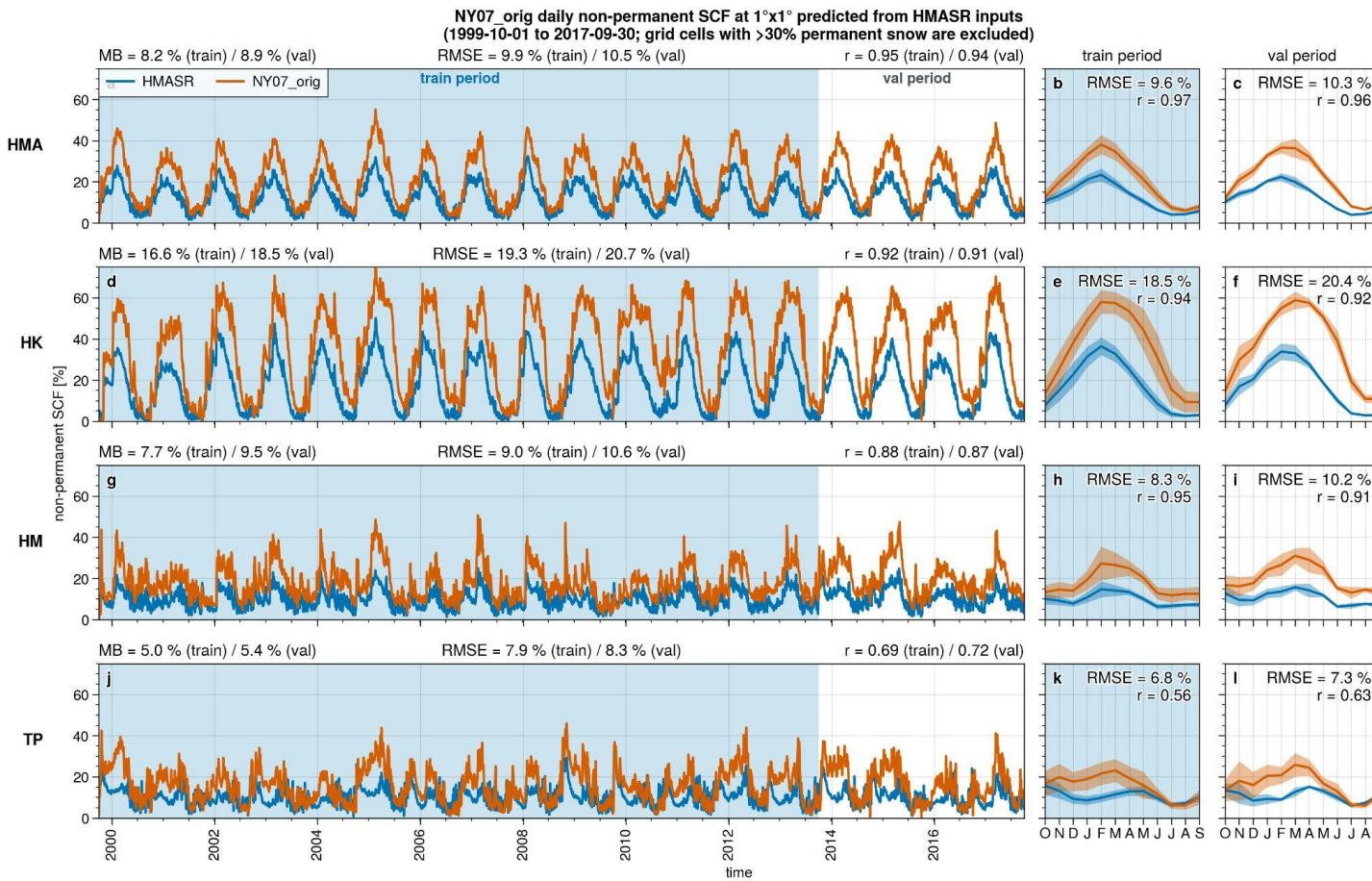


# High Mountain Asia UCLA Daily Snow Reanalysis

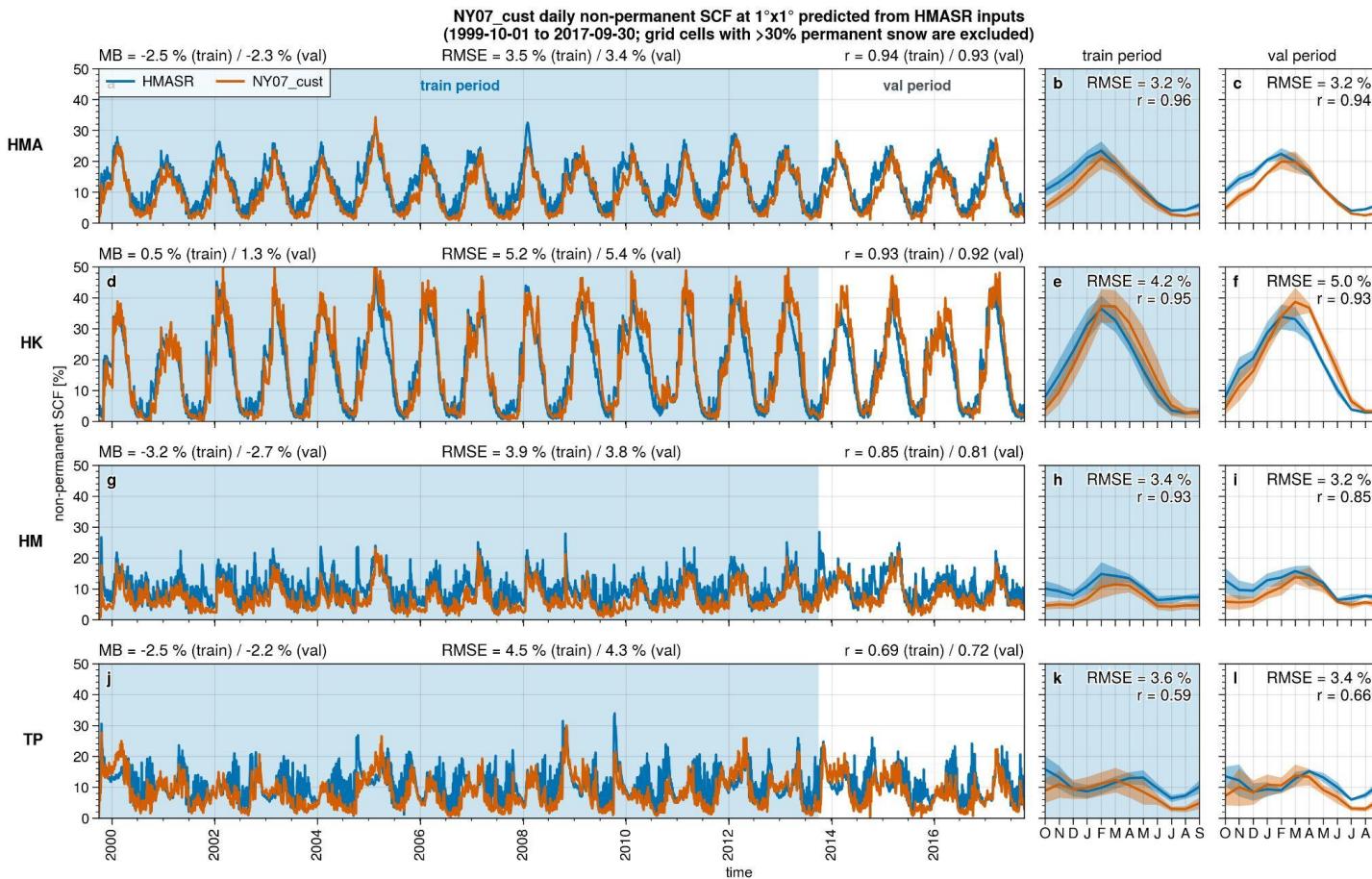
NY07\_cust non-permanent daily SCF (predicted from HMASR inputs) vs HMASR SD at 1°x1°  
(1999-10-01 to 2017-09-30 with >30% permanent snow grid cells excluded)



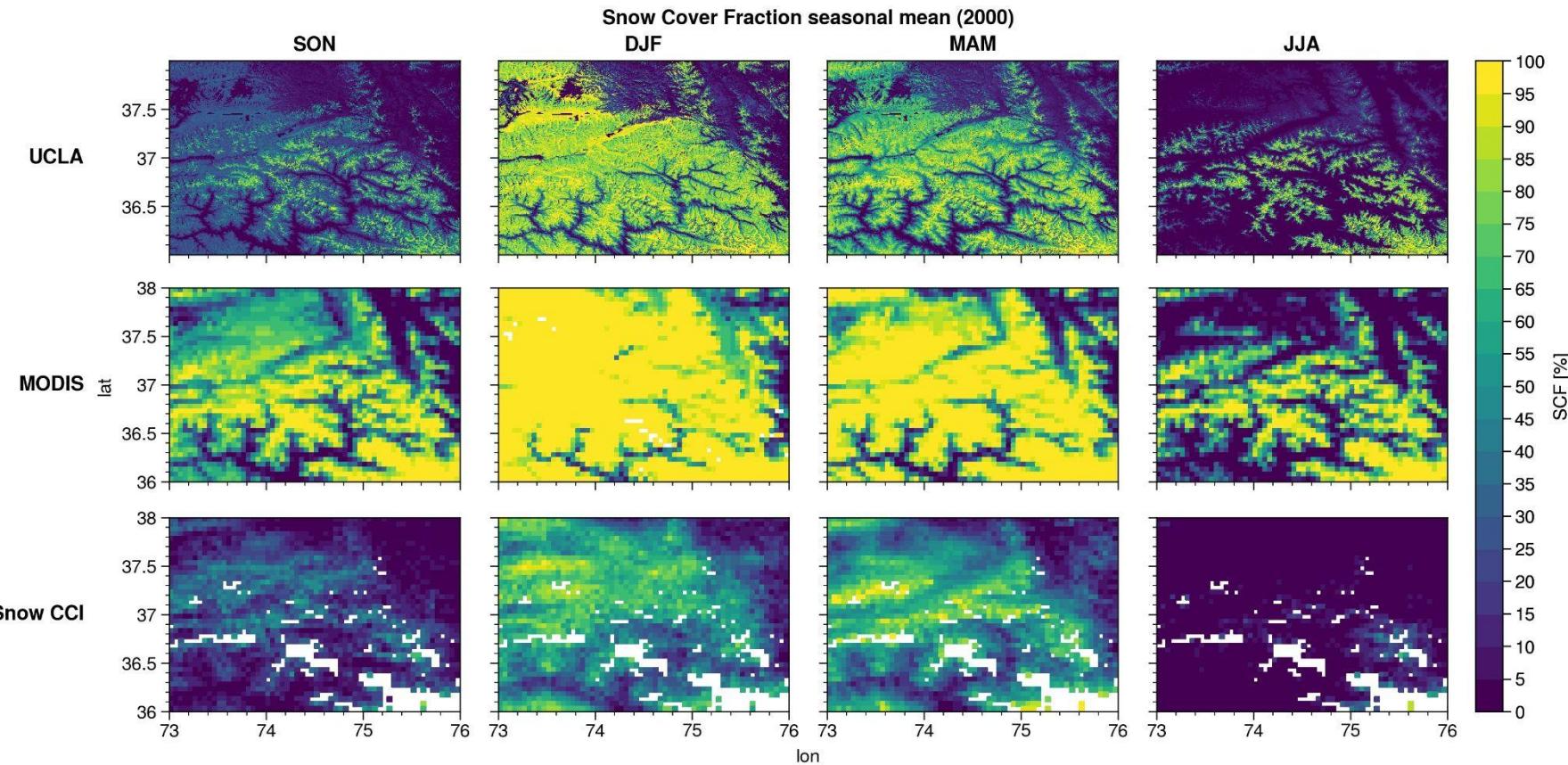
# High Mountain Asia UCLA Daily Snow Reanalysis



# High Mountain Asia UCLA Daily Snow Reanalysis

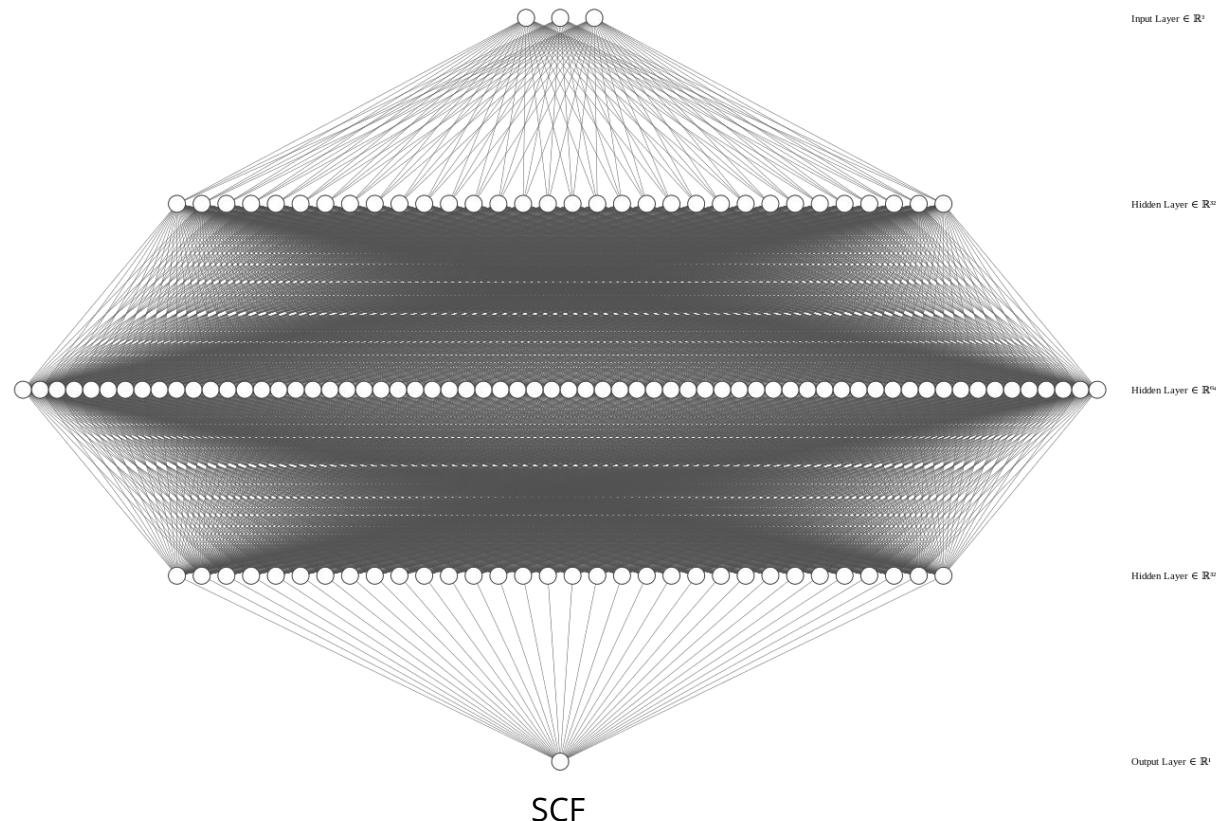


# High Mountain Asia UCLA Daily Snow Reanalysis

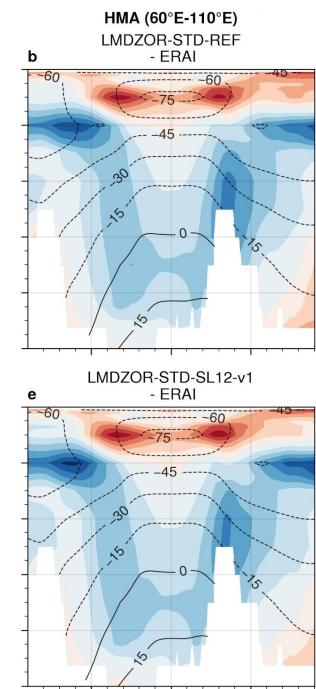
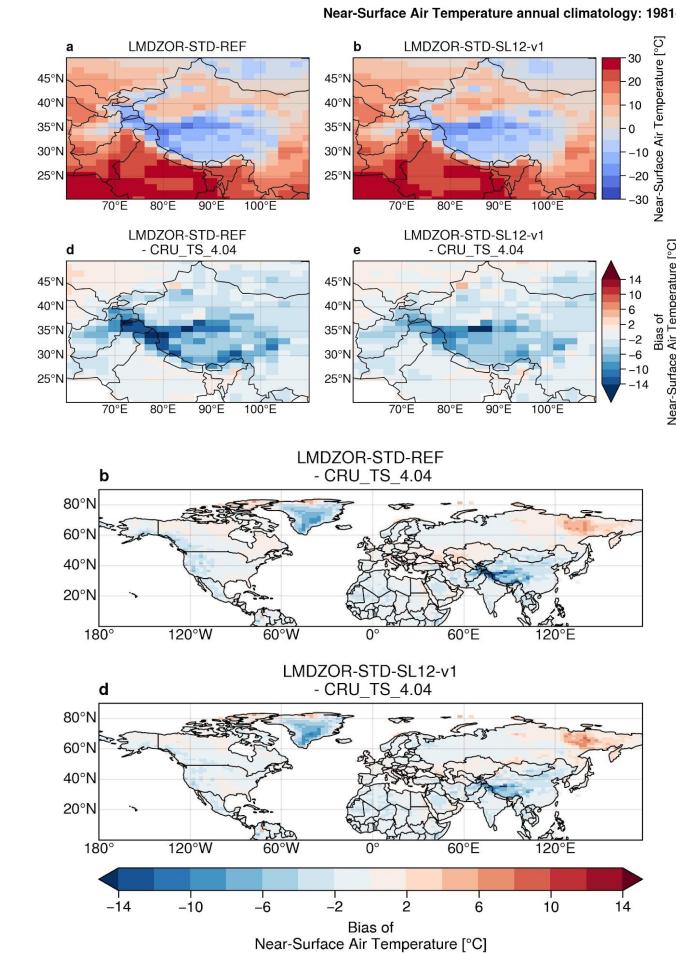
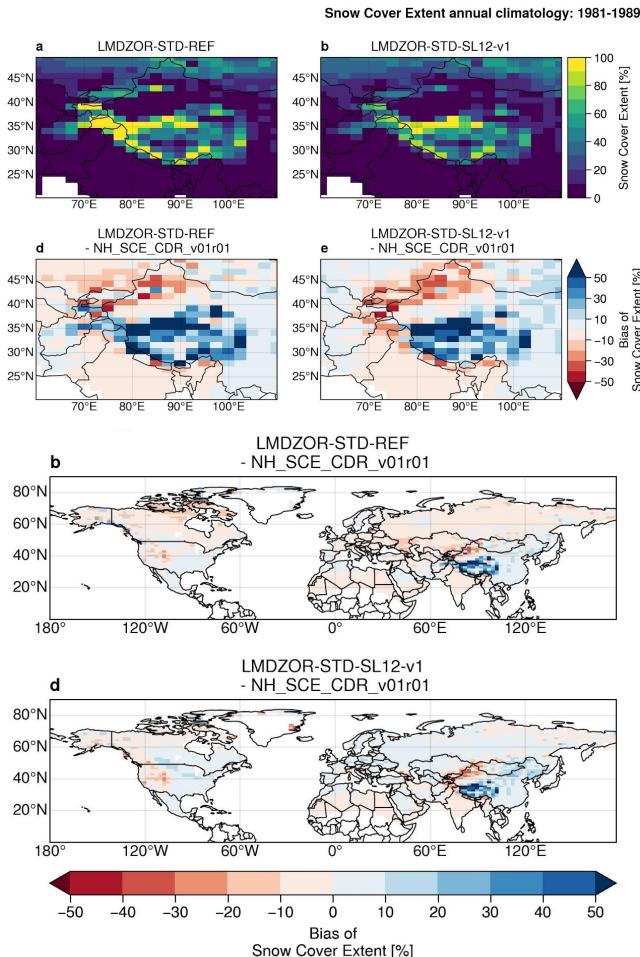


# Deep learning NN

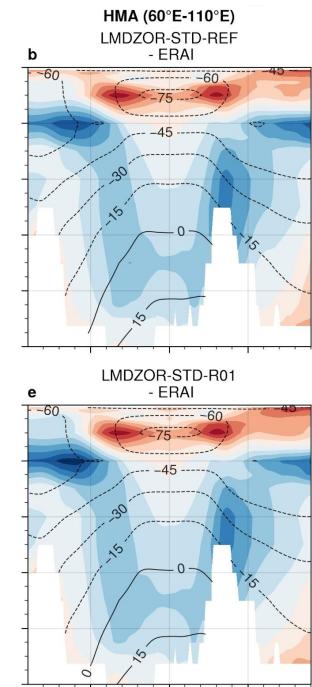
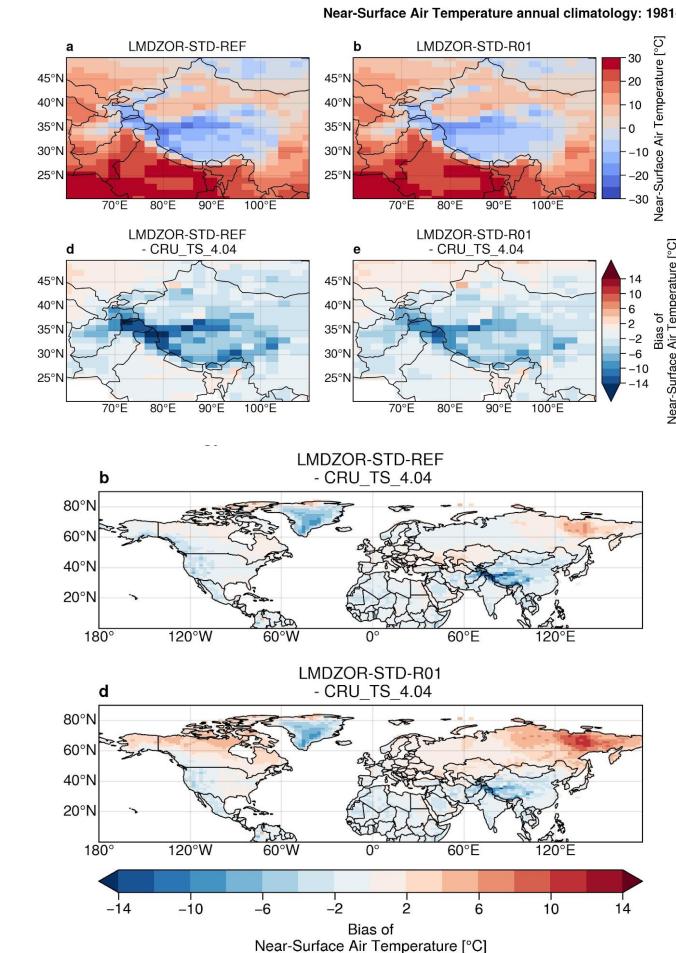
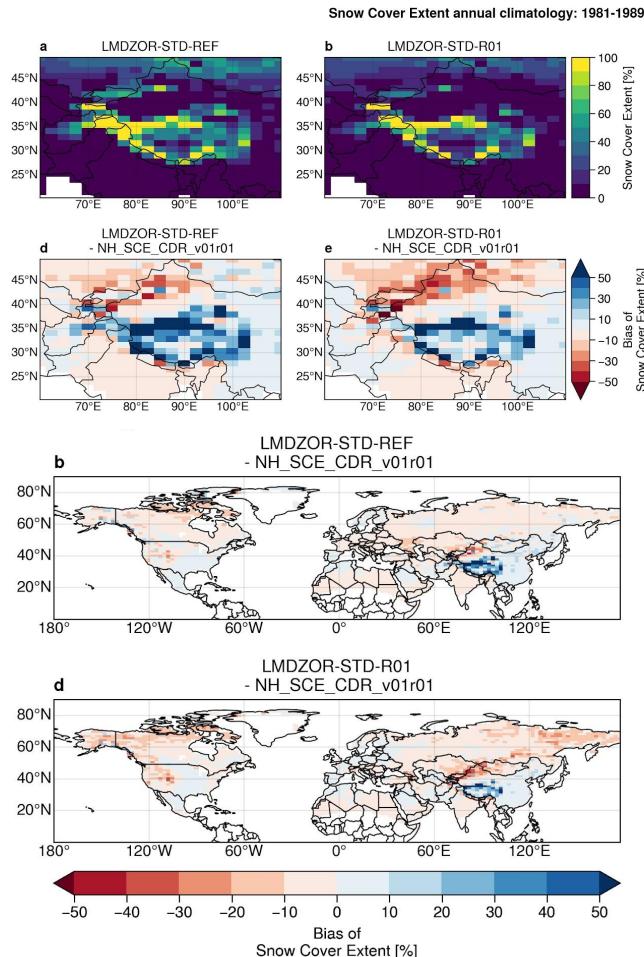
HMASR  
SD / SWE / STD topo



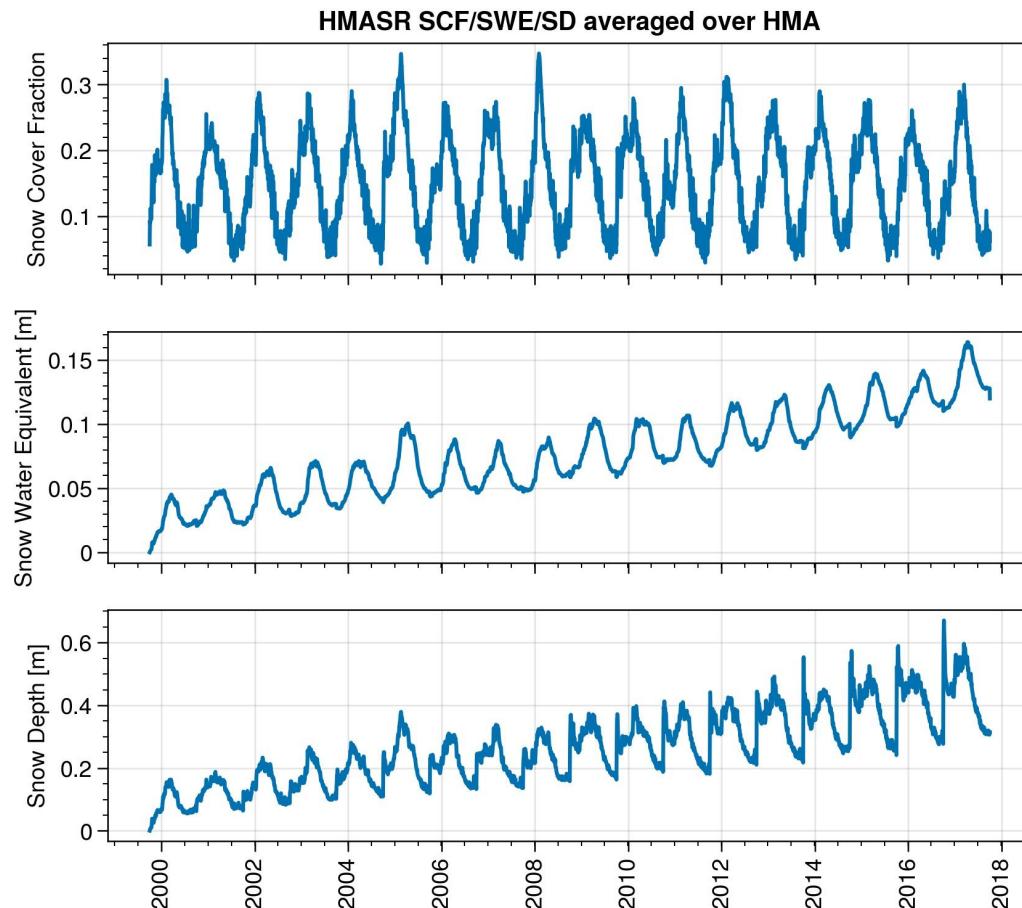
# Swenson and Lawrence (2012): commits 1, 2, 3, 4, [thredds](#)



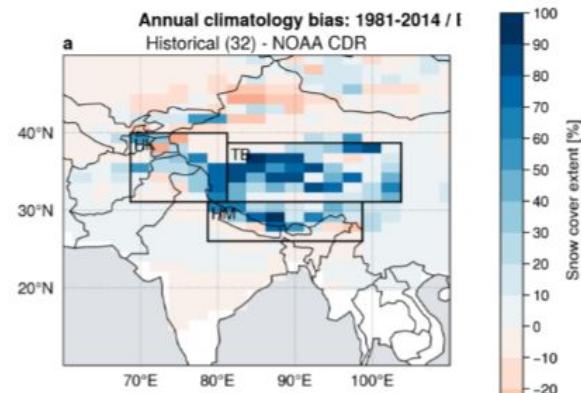
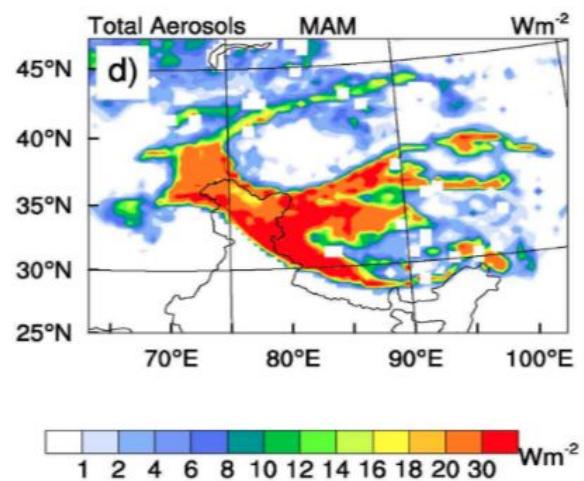
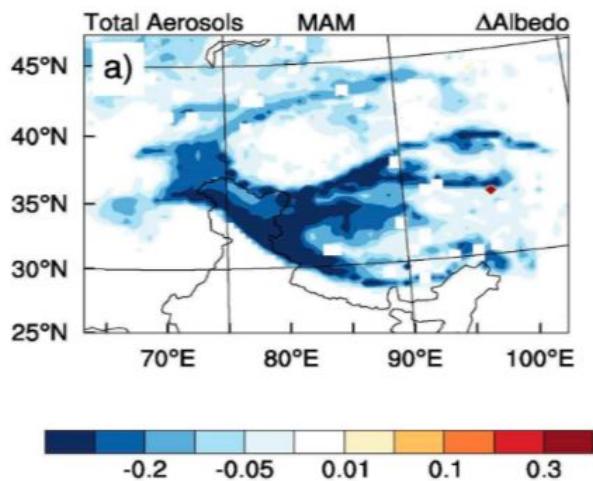
# Roesch et al. (2001) without veget: [code](#), [thredds](#)



# Permanent snow area: problem?



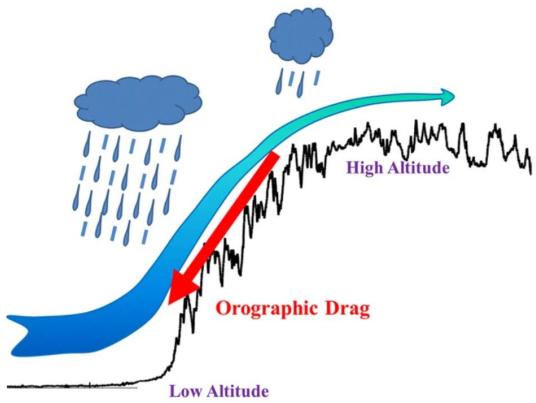
# Dépôt aérosols



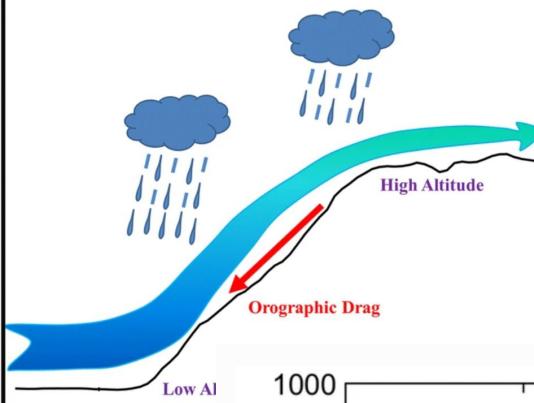
Usha et al., ([2020](#), Fig 7)

# TOFD

(a) Real Terrain



(b) Smooth Terrain



Wang et al., ([2020](#), Fig 5 & 9)

