



# Bias Analysis in the High Mountains of Asia (HMA)

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PhD Student 2019-2022

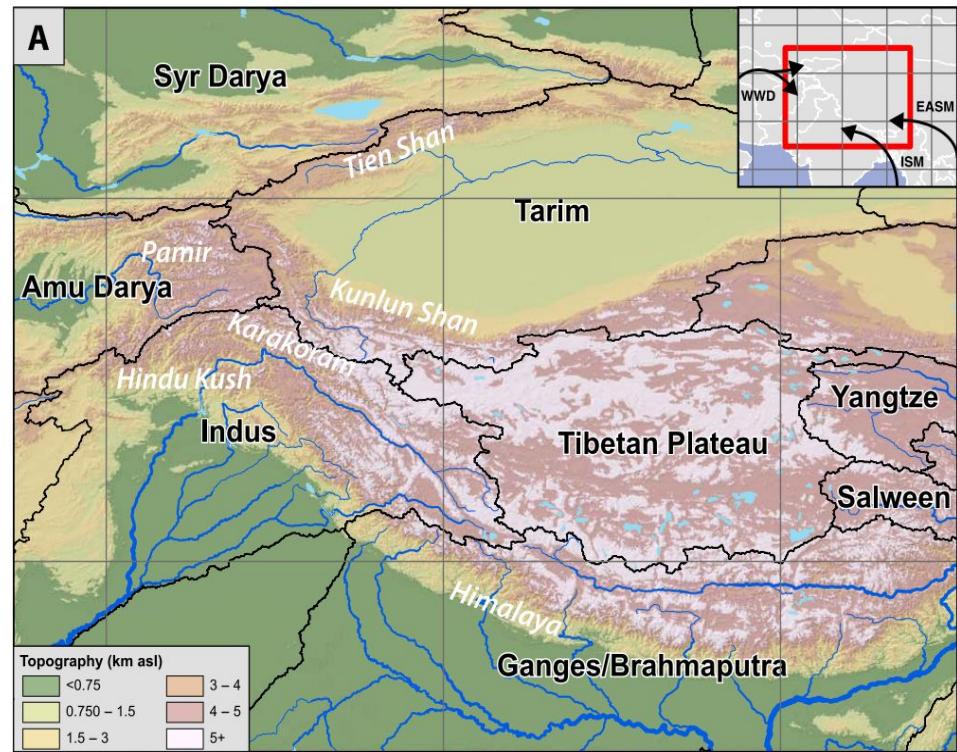
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Institut des Géosciences de l'Environnement (IGE, Grenoble, France)

Réunion Utilisateurs LMDZ — 05/06/2020

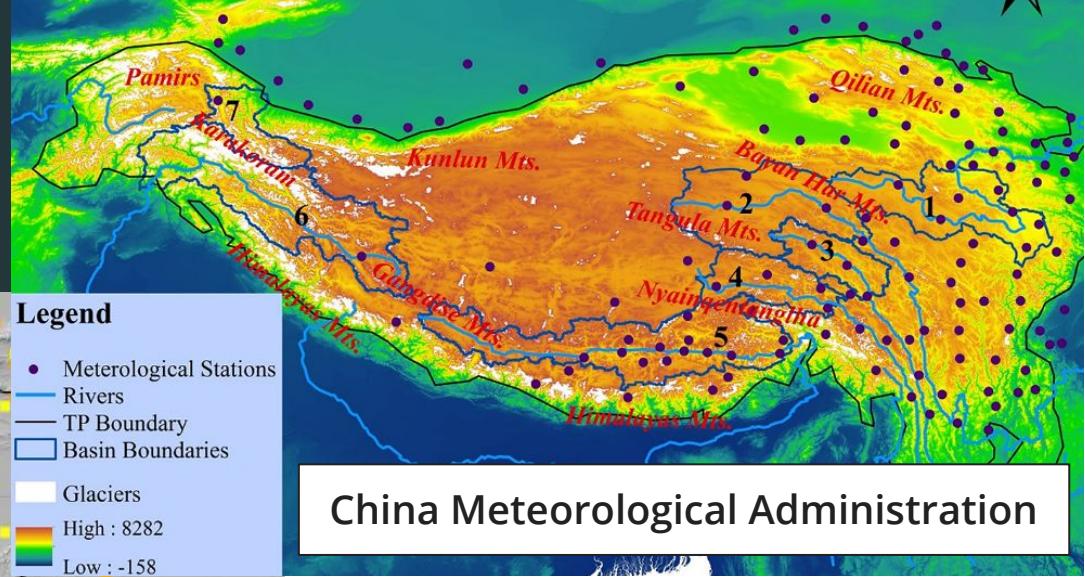
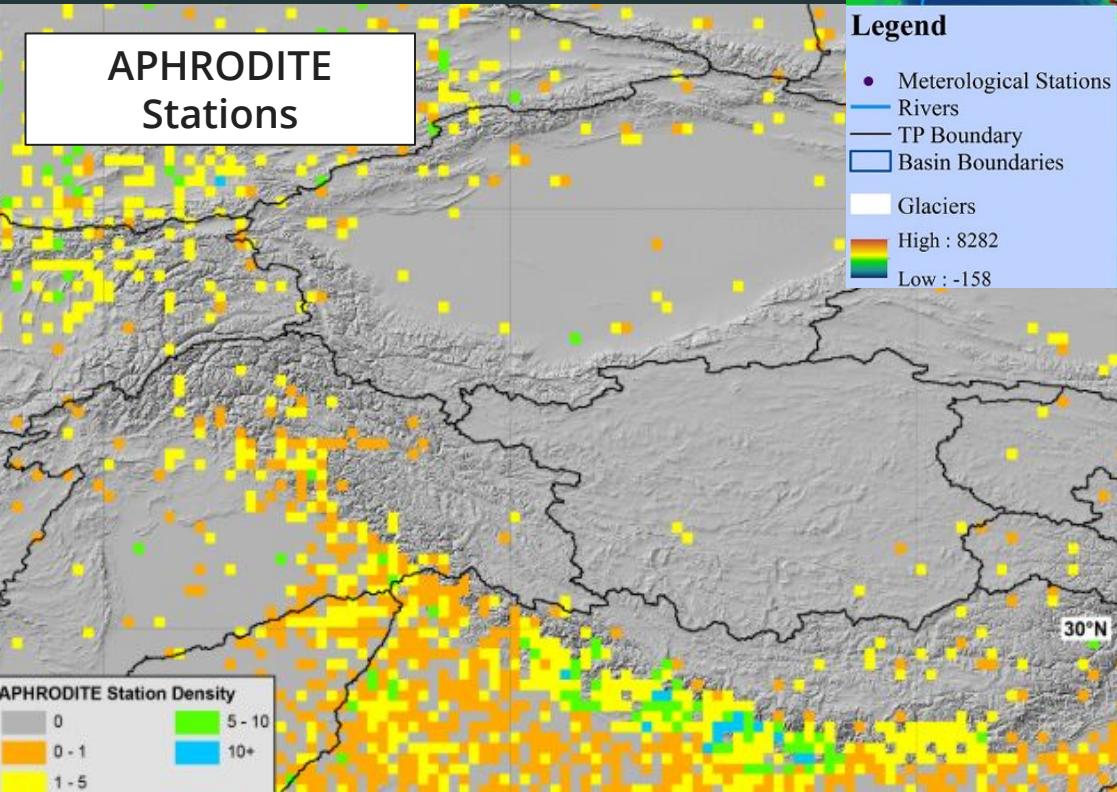
# High Mountain Asia (HMA): Introduction

- The Tibetan Plateau (TP) region is the **world's highest plateau** (average elevation 4000m)  
→ considerable influence on **regional and global climate**. (Orsolini et al., [2019](#))
- Directly sustain the livelihoods of **240 million people** in the mountain and hills of the Hindu Kush Himalaya. (Sharma et al., [2019](#))
- Two distinct climatic regimes:
  - winter **westerly disturbances**  
→ **50 % of the precipitation** over the western Himalaya and Hindu Kush mountains
  - central and eastern Himalayan mountains receiving **major part (up to 80%) of annual precipitation during the Indian summer monsoon** months (June-September). (Bookhagen and Burbank, [2010](#))



Smith and Bookhagen ([2018](#)), Fig. 1A

# High Mountain Asia (HMA): station observations



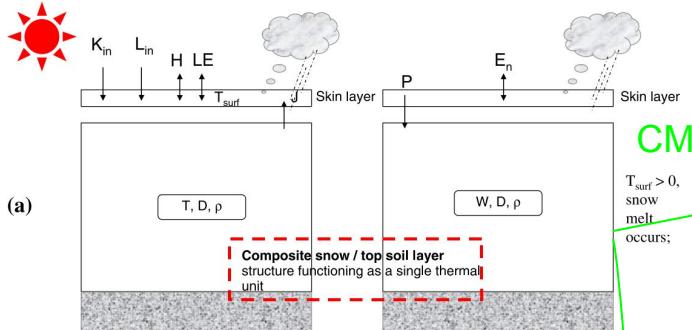
Li et al. (2018), Fig. 1

- Illustrates the **low station density** in the core of HMA (Tibetan Plateau)
- The **highest elevations are severely under-represented**
- **Almost exclusively measure rainfall** (there exist very few snow monitoring stations in HMA)

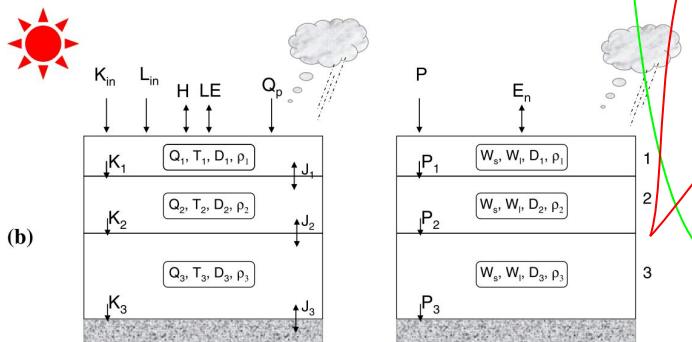
Smith and Bookhagen (2018), Fig. S1

# Snow bias in IPSL model CMIP5 versus CMIP6

WANG ET AL.: ORCHIDEE SNOW MODEL EVALUATION

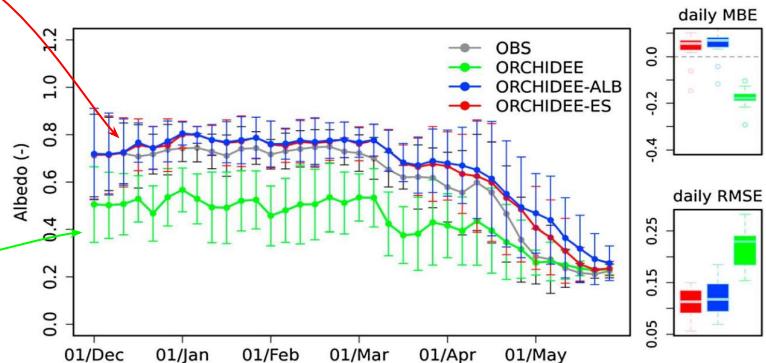
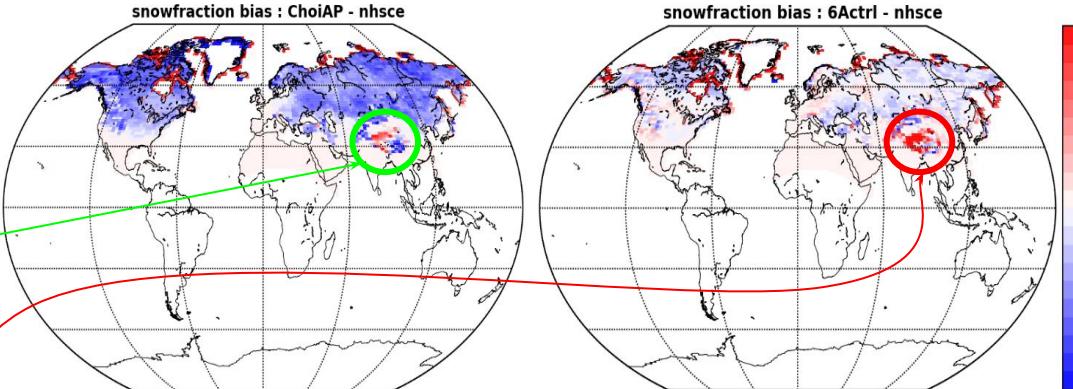


$K_{in}$  (short wave radiation),  $L_{in}$  (longwave radiation),  $H$  (sensible heat flux),  $LE$  (latent heat flux),  $J$  (conduction heat flux),  $W$  (SWE),  $D$  (snow depth),  $\rho$  (fixed snow density 330),  $P$  (precipitation),  $E_n$  (evaporation),  $T$  (snow temperature),  $T_{surf}$  (skin layer temperature)



$K_{in}$  (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)

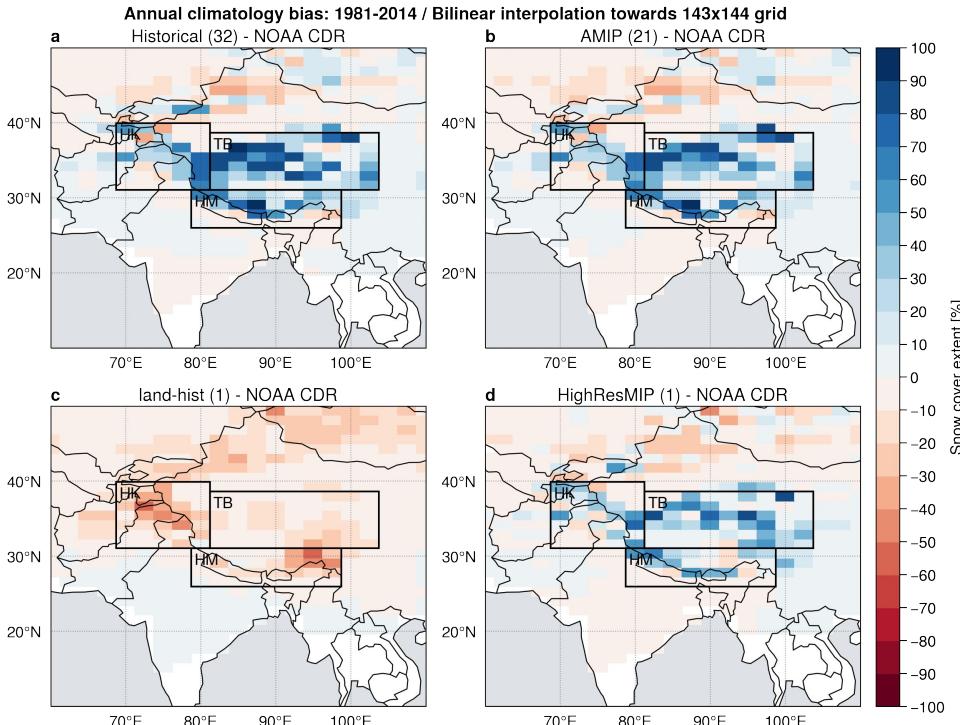
Wang et al. (2013), Fig. 1



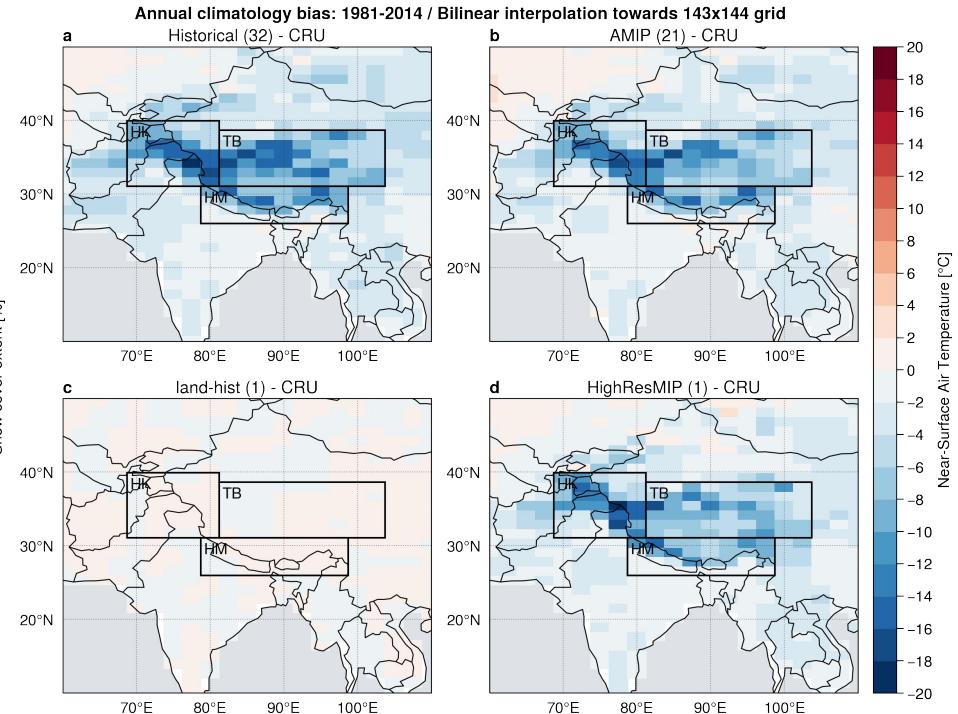
Wang et al. (2013), Fig. 5

# IPSL-CM6A-LR: Historical, AMIP, land-hist / IPSL-CM6A-ATM-HR bias

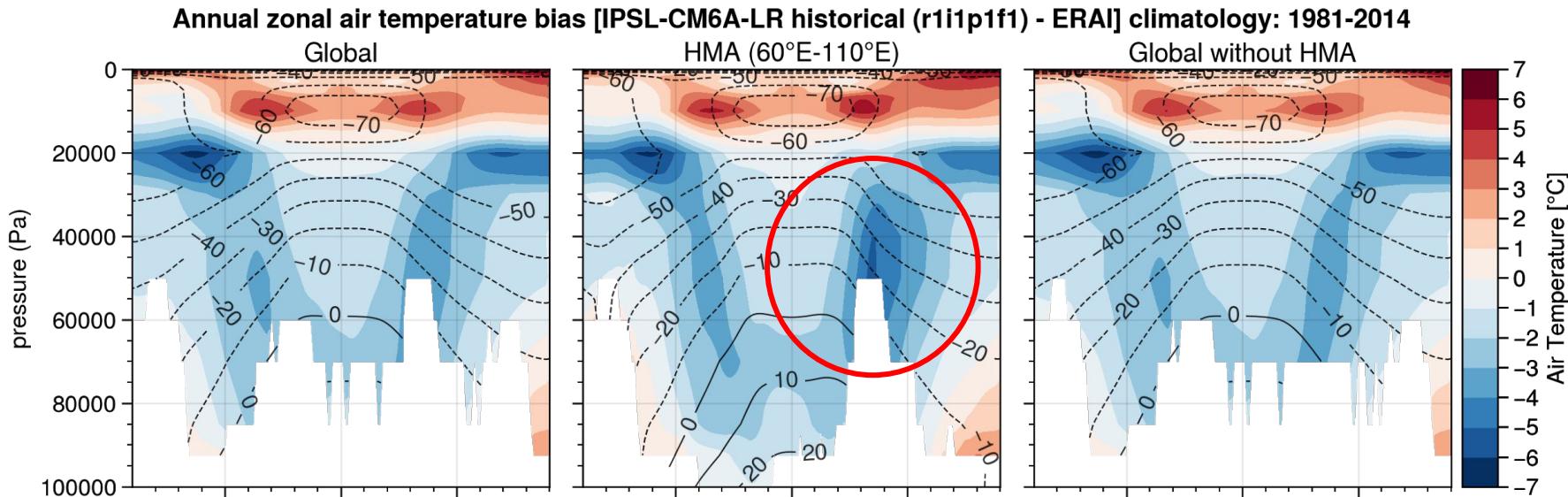
## Snow cover bias



## Temperature bias



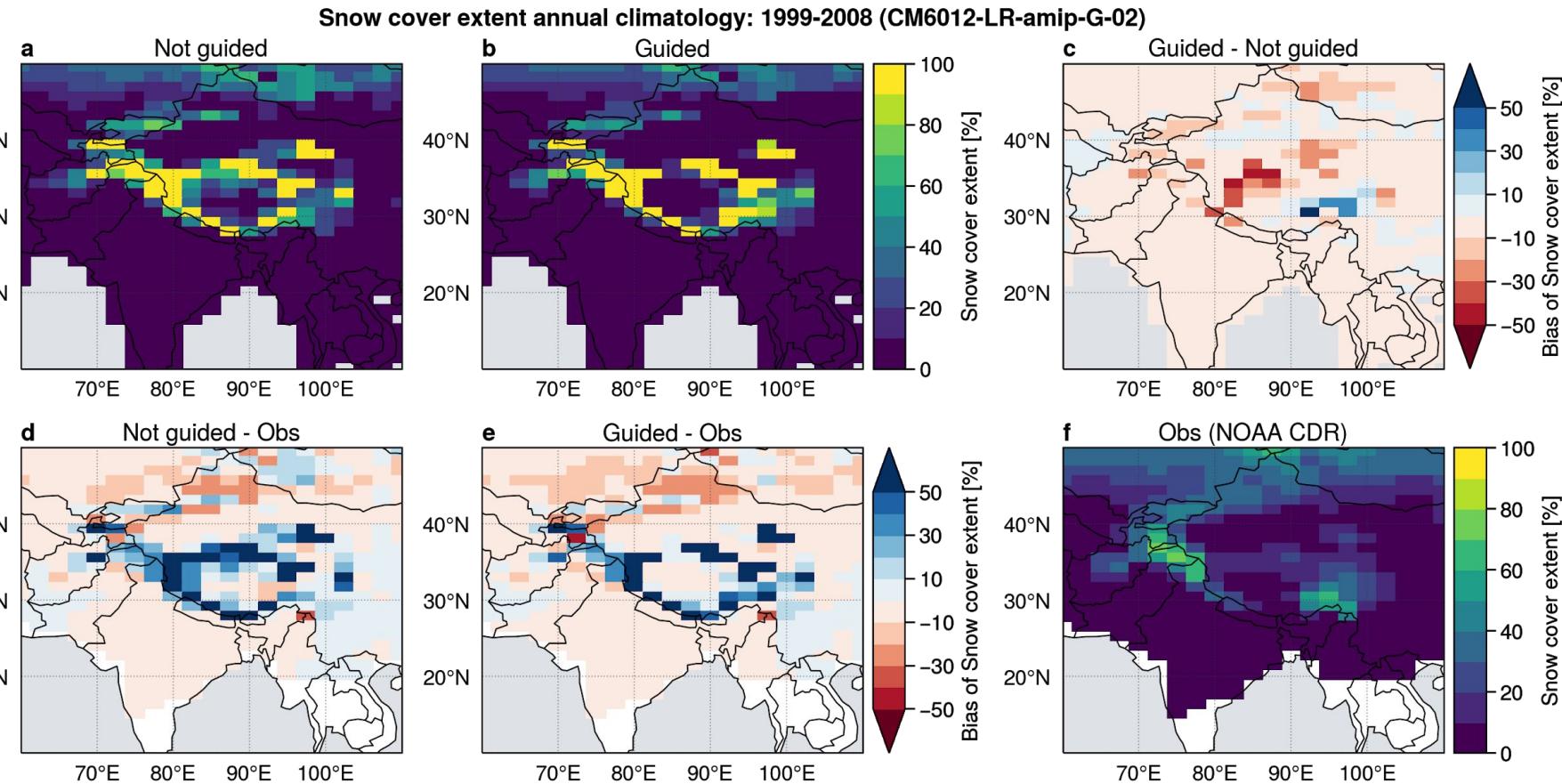
# Air Temperature zonal means bias global versus HMA



- Cold bias in troposphere and hot bias in stratosphere
- Cold bias of air temperature **not restricted to HMA!**
- HMA seems to **amplify** this bias
- The bias is **reduced in HighResMIP**

Adapted from from Boucher et al., Fig. 3 ([submitted](#))

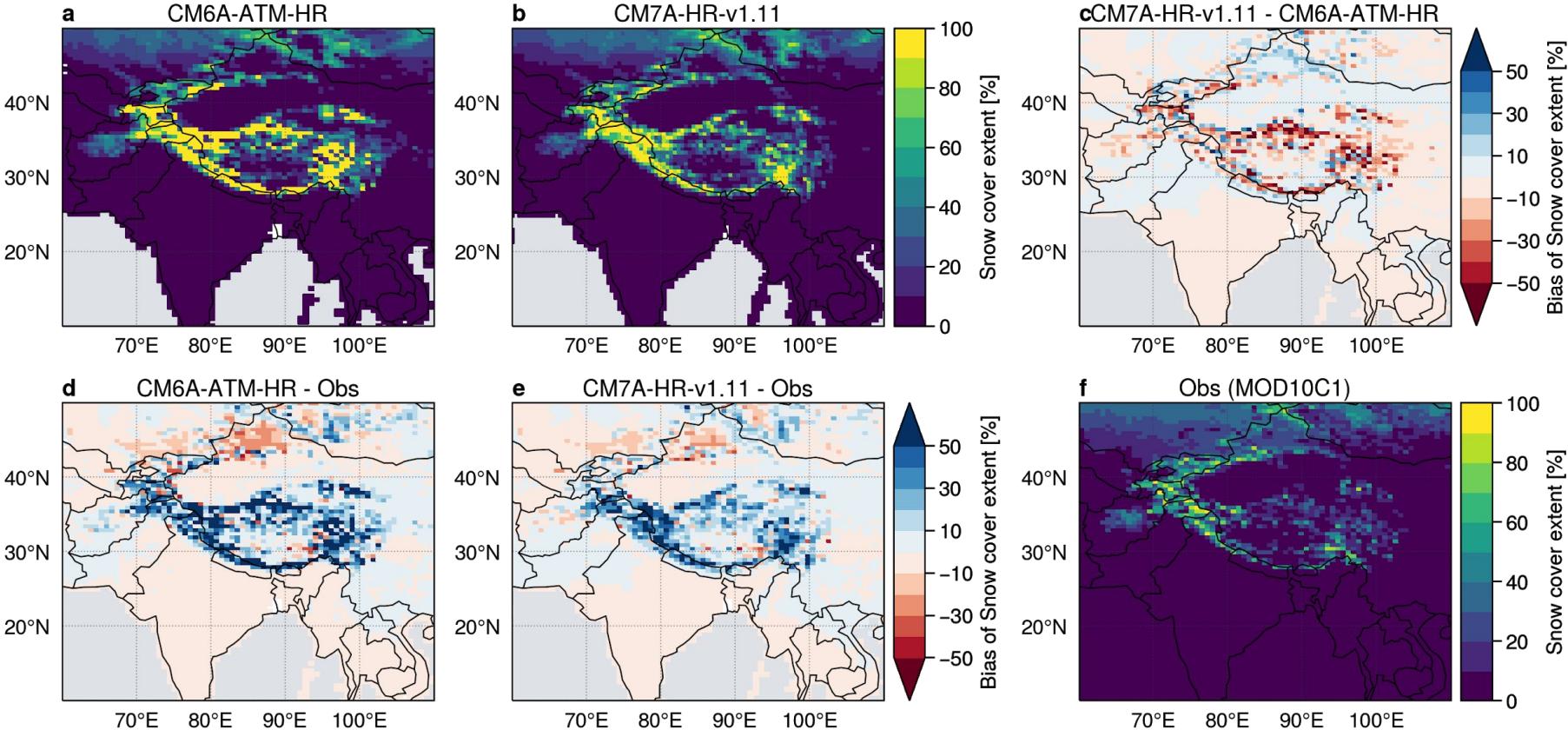
# Nudged versus not nudged: snow cover\*



\* Simulation: Frédérique Cheruy

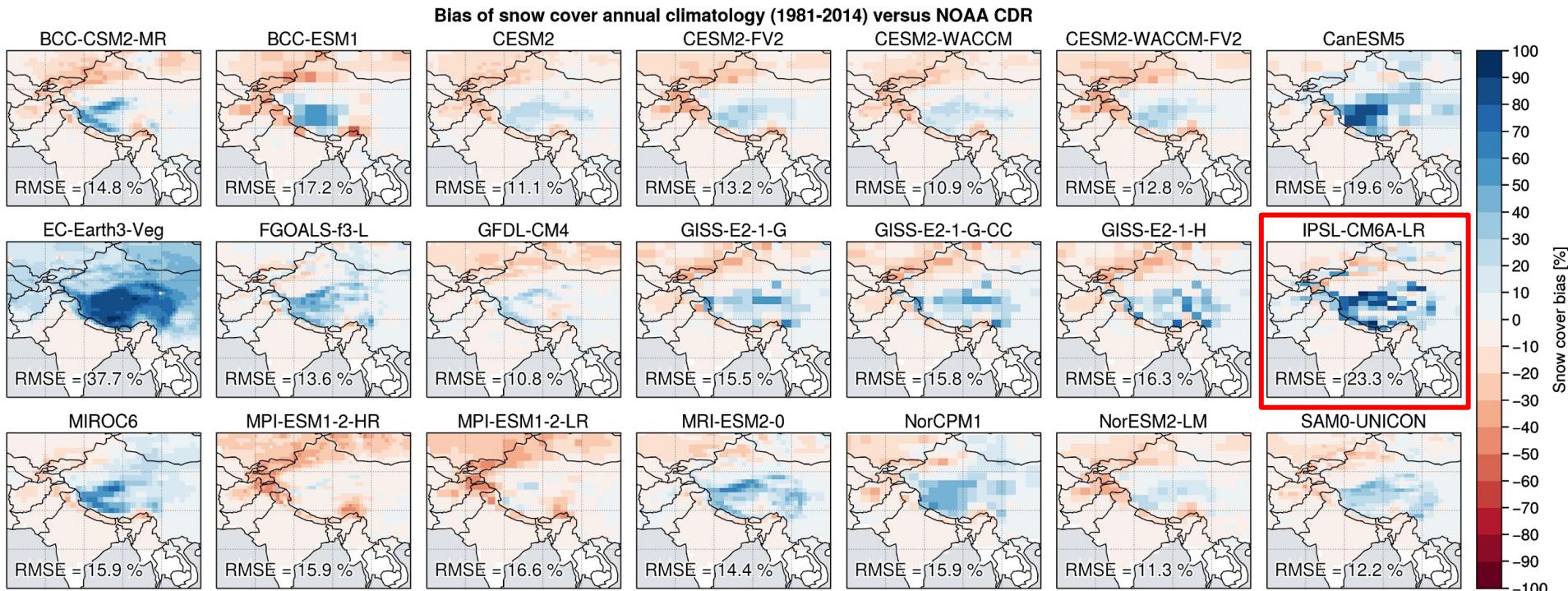
# Dynamico versus HighResMIP: snow cover\*

Snow cover extent annual climatology: 2001-2014



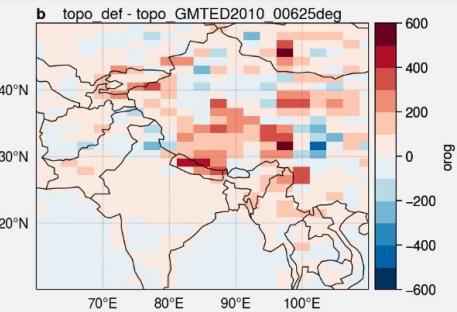
\* Simulation: Sébastien FROMANG

# CMIP6 other models: snow cover bias



# Different options

## Problem with elevation?



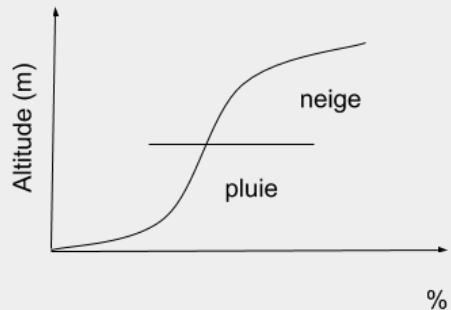
Original file of elevation has **more than 500 m differences** locally!

→ 2 experiments with original and new topographic file in process

See more:

[https://lmdz.lmd.jussieu.fr/utilisateurs/reunion\\_utilisateurs/2018/lmdz2018-sepulchre.pdf](https://lmdz.lmd.jussieu.fr/utilisateurs/reunion_utilisateurs/2018/lmdz2018-sepulchre.pdf)

## Problem with subgrid parameterization?



Wrong phase distribution / surface energy budget over complex terrain?

→ Walland and Simmons, [1996](#): SUB-GRID-SCALE TOPOGRAPHY AND THE SIMULATION OF NORTHERN HEMISPHERE SNOW COVER

→ Younas et al., [2017](#): A strategy to represent impacts of subgrid-scale topography on snow evolution in the Canadian Land Surface Scheme



# Conclusions

- Larger **snow cover bias** in CMIP6 than CMIP5 over **HMA**
- land-hist: no bias / AMIP: bias -> **coupled with the atmosphere**
- Possible link with the **cold bias in the troposphere**
- Bias reduced with nudge / higher resolution / dynamico
- Other possible source of the bias:
  - precipitation, albedo, cloud cover, aerosols, boundary layer, surface energy budget
- Future work:
  - CMIP6 multimodel analysis
  - Subgrid topography parameterization in LMDZ

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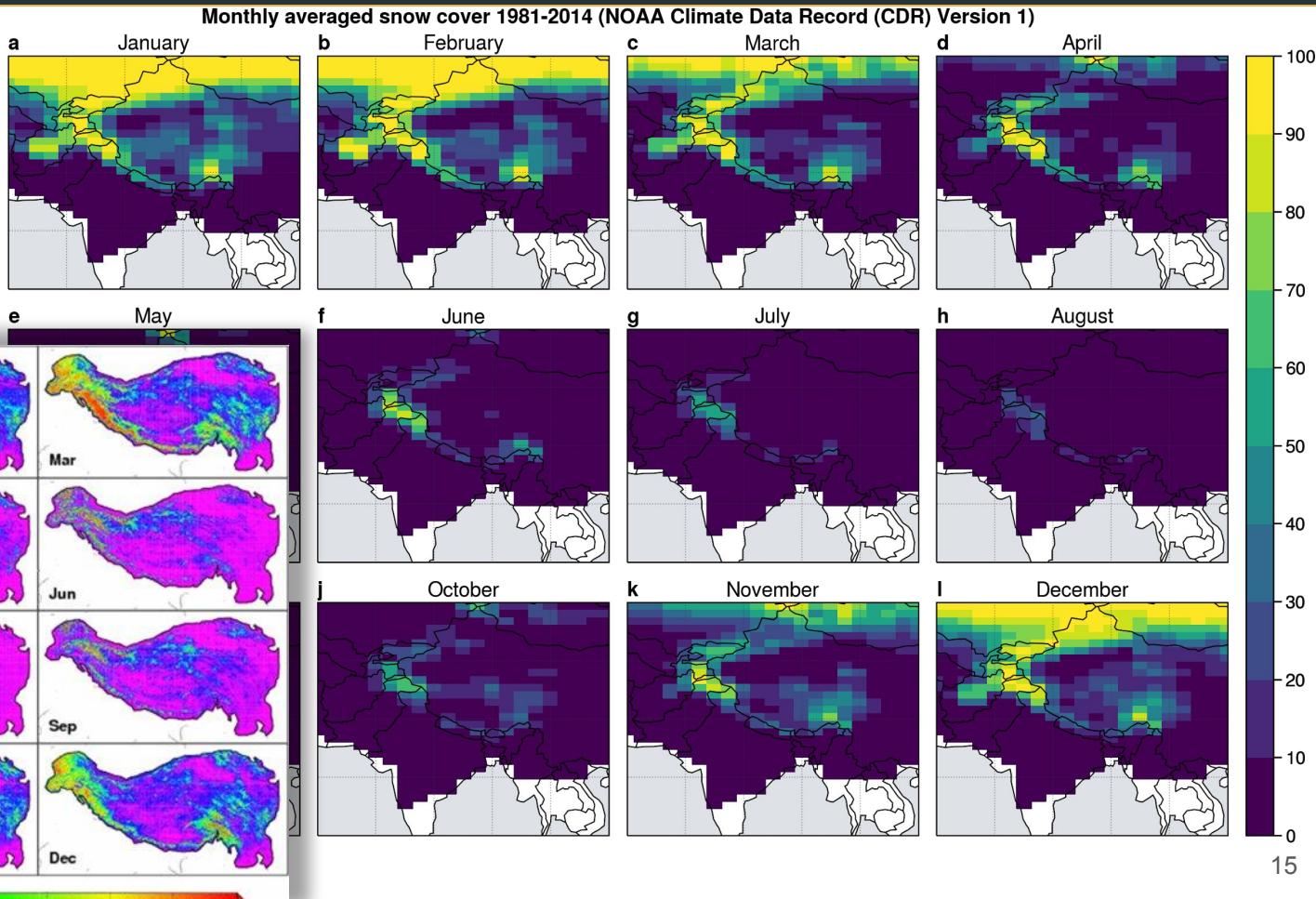
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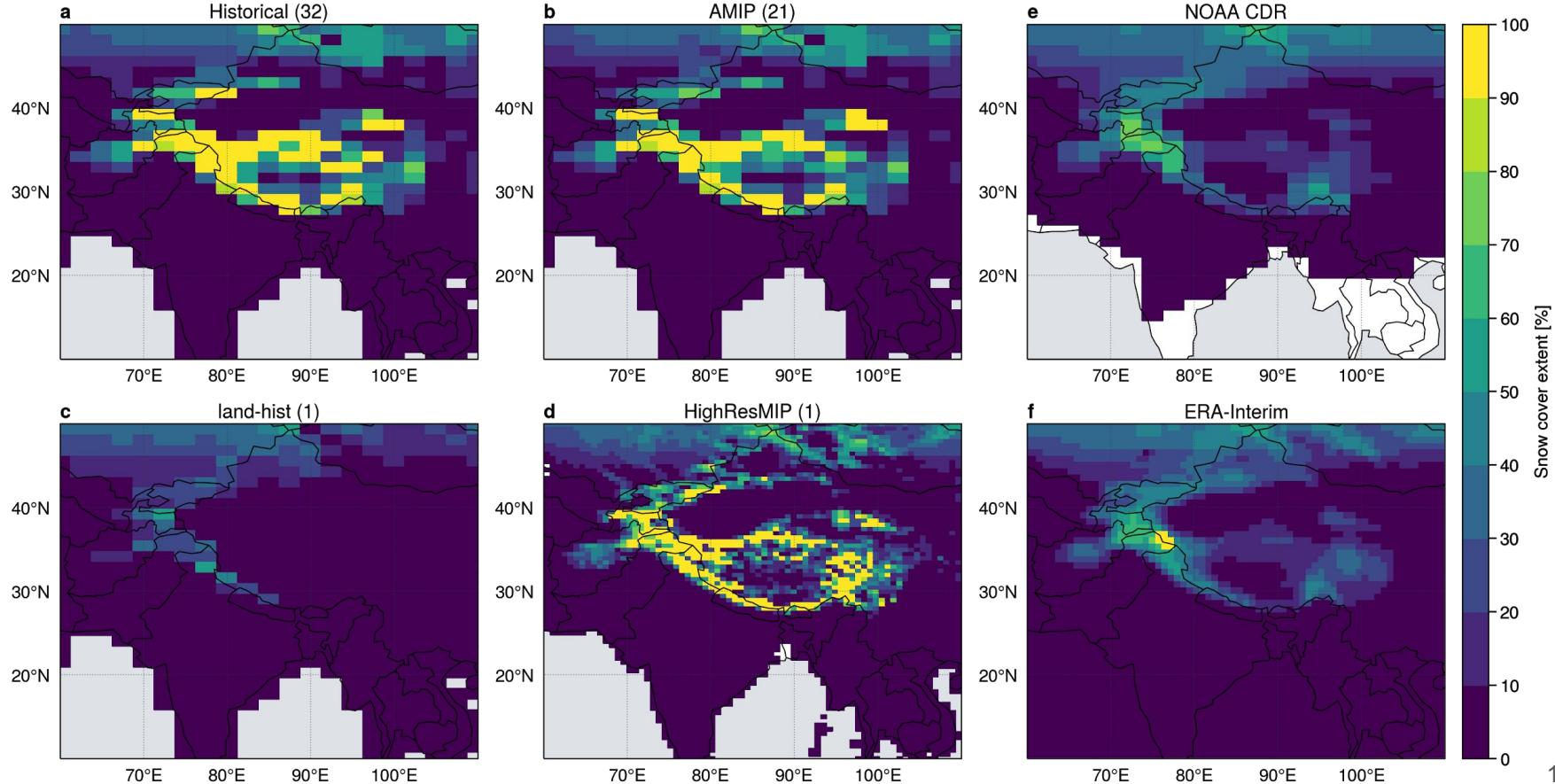
# Monthly snow cover climatologies (from satellite observations)

NOAA Climate Data Record (CDR) of Northern Hemisphere (NH) Snow Cover Extent (SCF), Version 1  
(1981-2014)

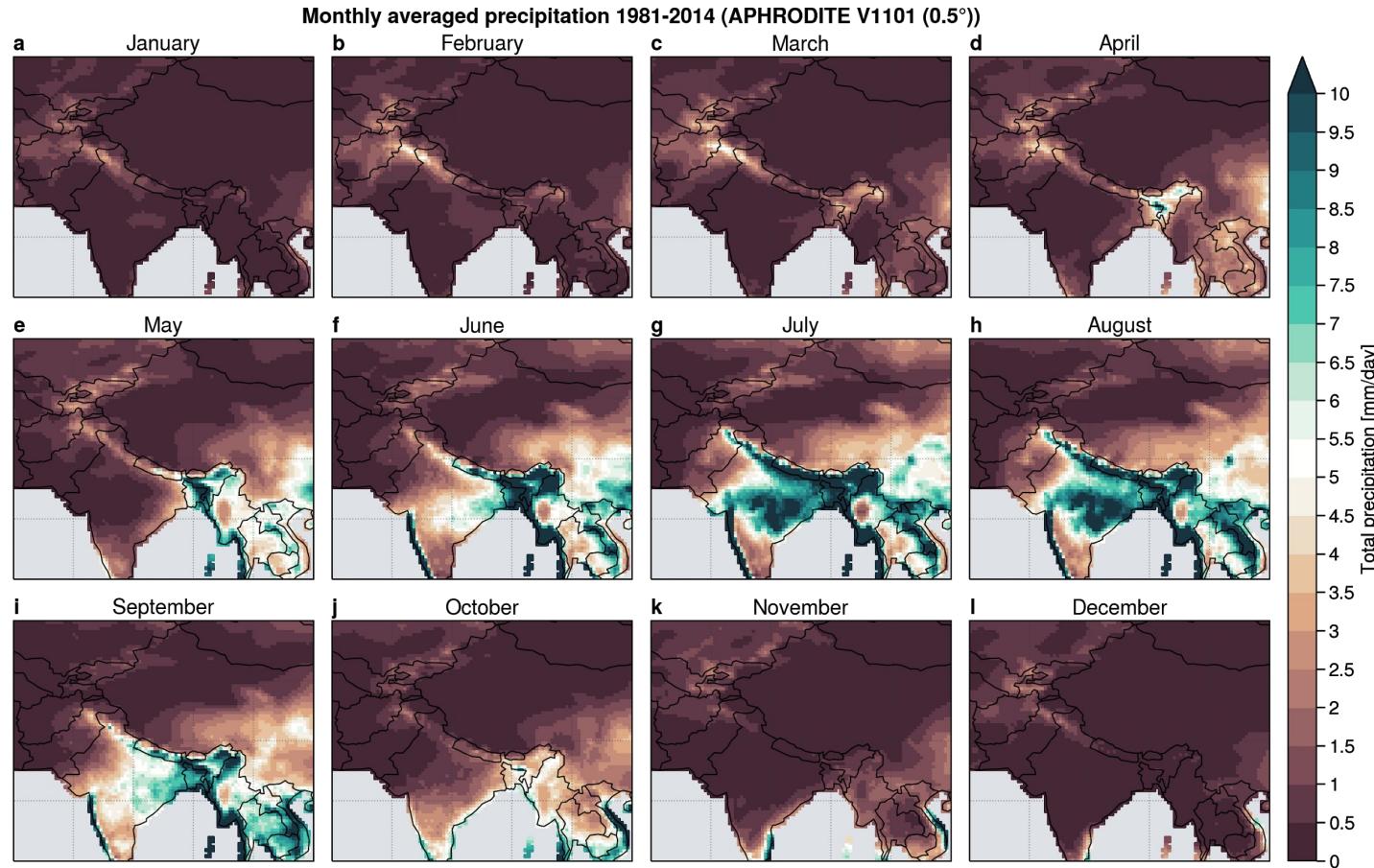


# Snow cover climatology (1981-20014)

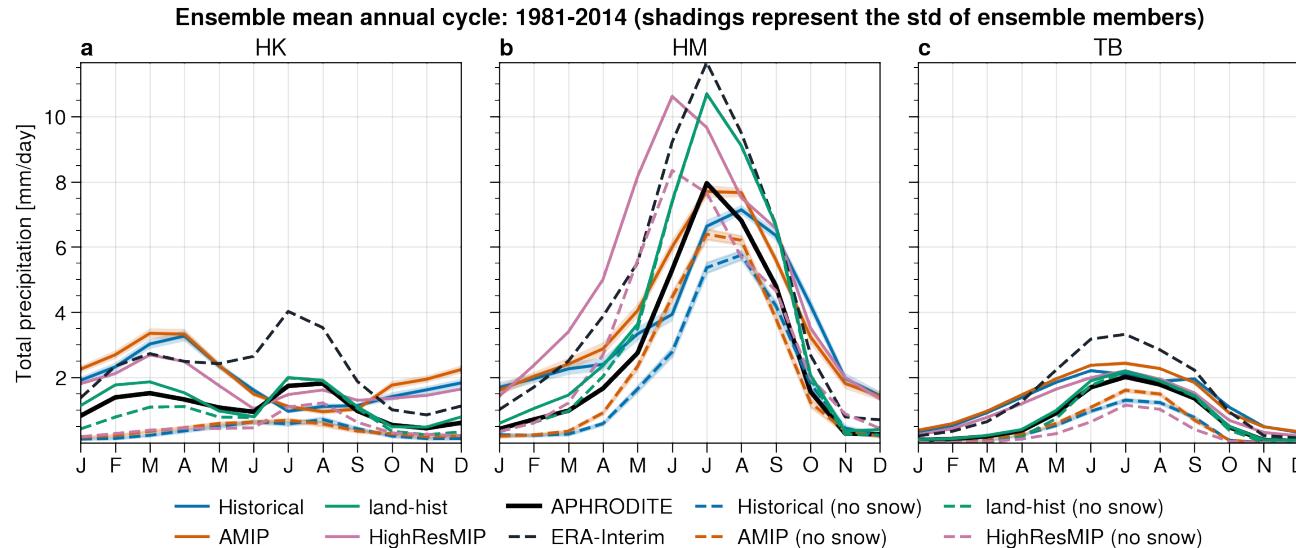
Annual climatology: 1981-2014 / Models: IPSL-CM6A-LR (143x142), IPSL-CM6A-ATM-HR (361x512) / Observation: NOAA Climate Data Record (CDR) Version 1



# Precipitation climatologies (APHRODITE)



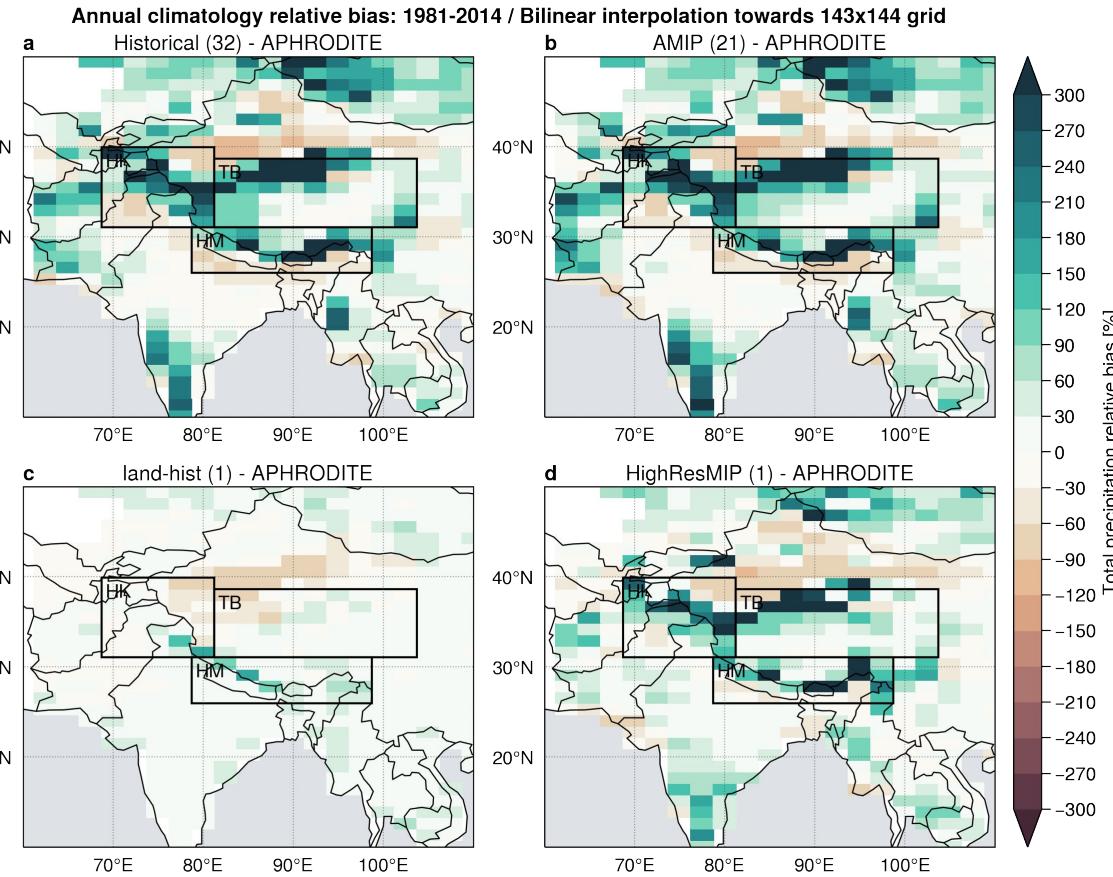
# Precipitation: annual cycles



**“ERA-Interim strongly overestimates precipitation compared to the other data sets, and so does EC-Earth in the HKK domain, probably owing to the fact that both ERA-Interim and EC-Earth provide total precipitation while the in situ station and satellite data, as well as their combinations, have difficulties in detecting the snow component of precipitation. The analysis of liquid-only precipitation in ERA-Interim and EC-Earth generally gives results closer to the observations.”**

(Palazzi et al., 2013)

# IPSL-CM6A-LR: Historical, AMIP, land-hist / IPSL-CM6A-ATM-HR bias



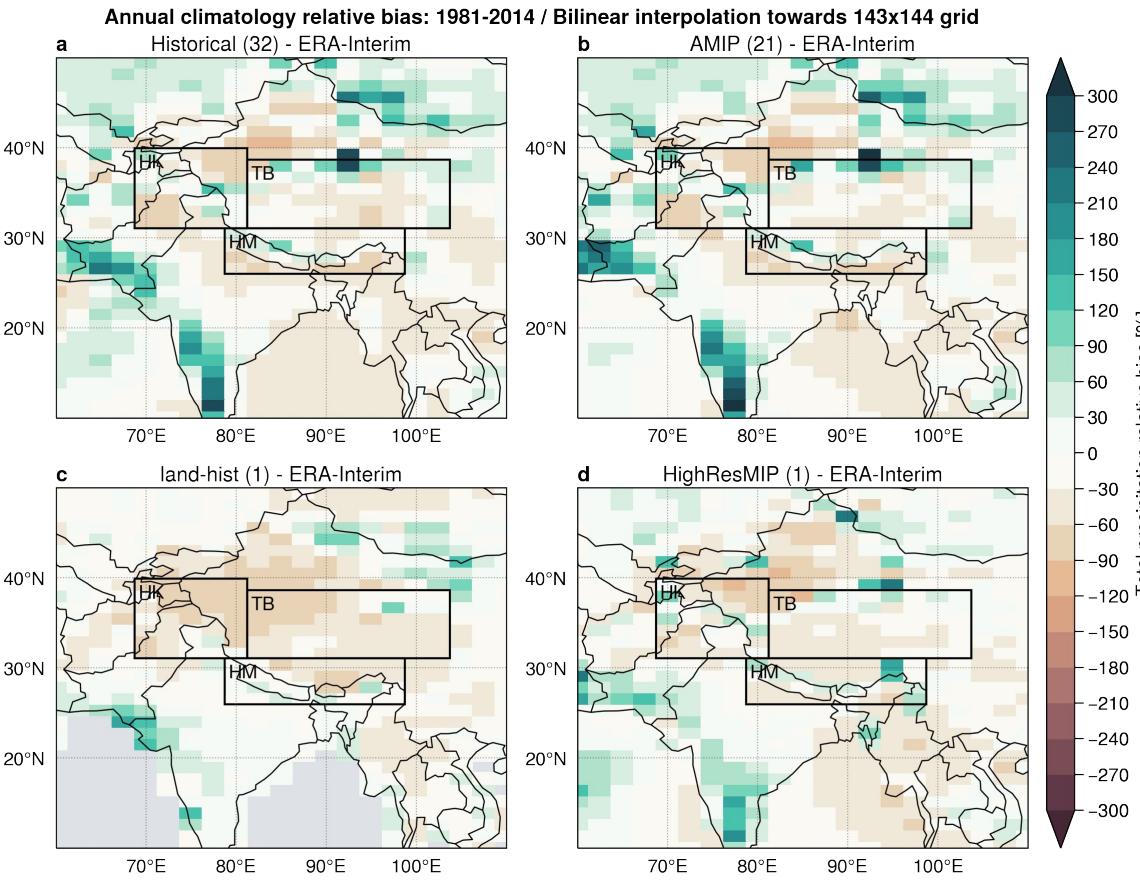
Total precipitation **relative bias**  
(versus stations observations)

BUT... ([see ERAI](#))

All in situ stations and satellite data tends to underestimate the snow component!

- The in situ station and satellite data, as well as their combinations, have **difficulties in detecting the snow** component of precipitation. (Palazzi et al., [2013](#))
- An independent validation with observed river flow confirms that the water balance can indeed only be closed when **the high altitude precipitation on average is more than twice as high and in extreme cases up to a factor of 10 higher than previously thought**.  
(Immerzeel et al., [2015](#))

# IPSL-CM6A-LR: Historical, AMIP, land-hist / IPSL-CM6A-ATM-HR bias



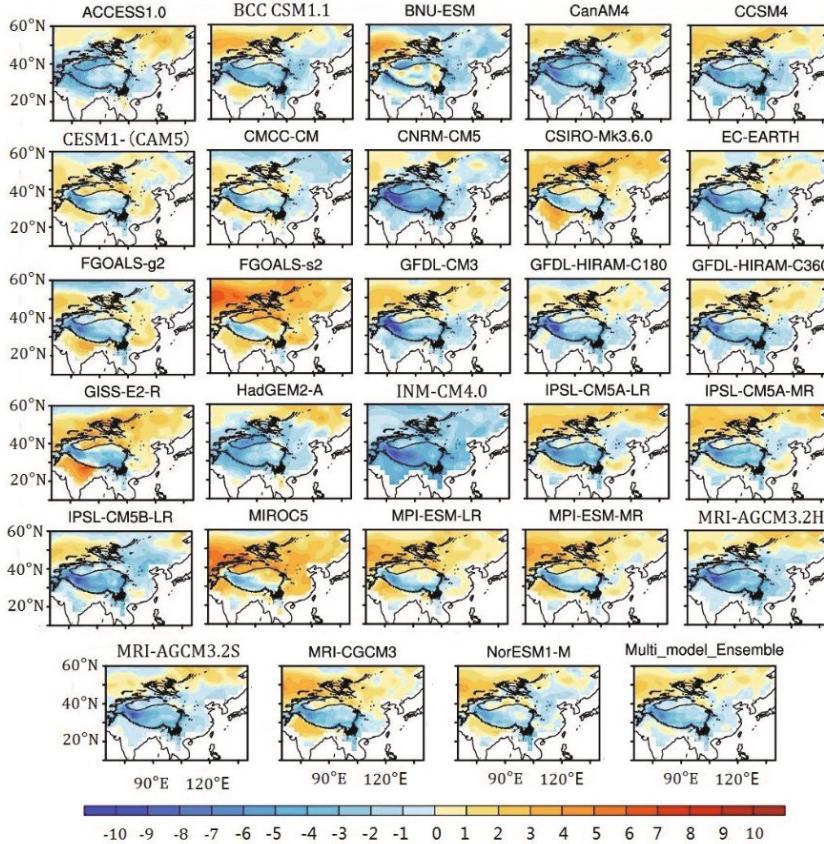
Total precipitation **relative bias**  
(versus reanalysis)

BUT...

"ERA-Interim strongly overestimates precipitation compared to the other data sets, and so does EC-Earth in the HKK domain, probably owing to the fact that both ERA-Interim and EC-Earth provide total precipitation while the in situ station and satellite data, as well as their combinations, have difficulties in detecting the snow component of precipitation. The analysis of liquid-only precipitation in ERA-Interim and EC-Earth generally gives results closer to the observations." (Palazzi et al., [2013](#))

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# “Cold bias” over Tibetan Plateau

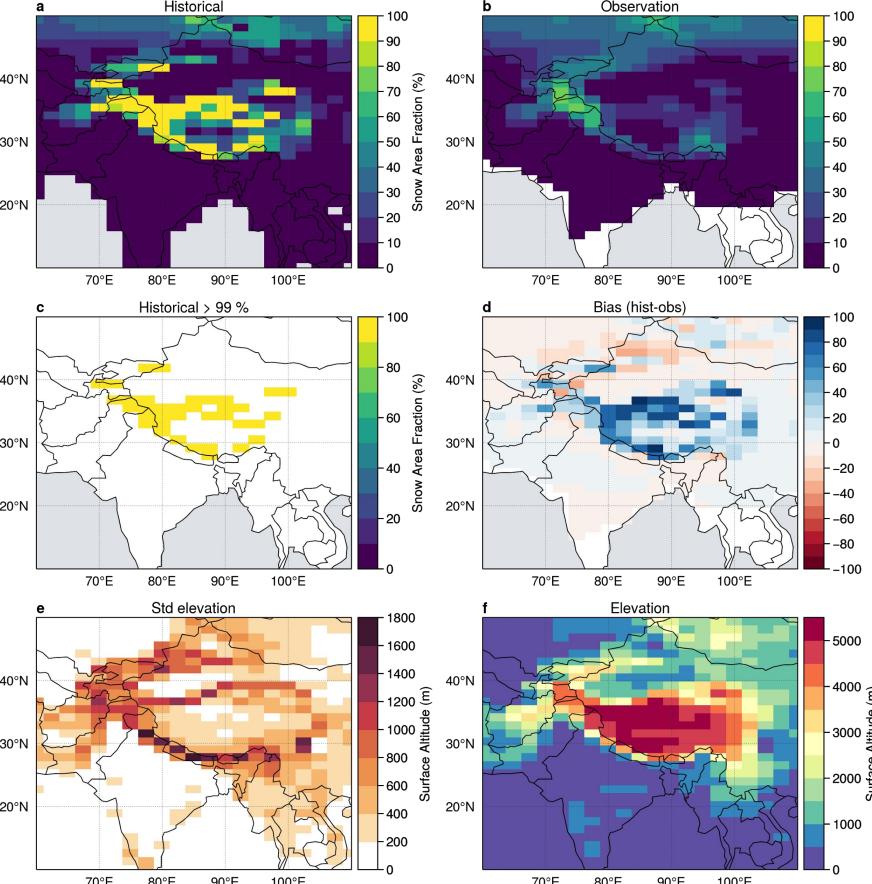


**Fig. 2.** Annual mean  $T_{as}$  ( $^{\circ}\text{C}$ ) differences between various models and CRU data averaged during 1979–2005. All air temperature values in the models have been corrected to real elevation at a resolution of  $2.5^{\circ} \times 2.5^{\circ}$ .

- The large **cold biases** are located in the **mountainous areas**, such as the Rocky Mountains, the **Tibetan Plateau**, the Andes, Greenland, and Antarctica, and seem to be proportional to the topographic height. (Mao and Robock, [1998](#) — First AMIP experiments)
- These cold biases are partly attributable to the simulation of **excess precipitation** in these regions (Lee & Suh, [2000](#)). The **lack of high-elevation observation stations** in the CRU data may also be partly responsible for the apparent cold bias of the model (Gu et al., [2012](#)). (Wang et al., [2013](#) — regional climate model RegCM)
- This feature may imply a common **deficiency in the representation of snow-ice albedo** in the diverse models. It appears that the **systematic bias** and the **significant problems over the mountain regions** (e.g., the Tibetan Plateau) **still remain in the CMIP5 models**. (Su et al., [2013](#))
- **GCMs show predominant cold biases in T500**, which may be caused by penetration of dry and cold air from the deserts of western Asia due to an **overly smoothed representation of topography** west of the TP (Boos and Hurley, [2013](#)). (Xu et al., [2017](#) — CMIP5)
- The results suggest that improvements in the **parameterization of the area of snow cover**, as well as the boundary layer, and hence **surface turbulent fluxes**, may help to reduce the cold bias over the TP in the models. (Chen et al., [2017](#) — surface energy budget CMIP5)
- Others: Salunke et al. ([2019](#)), etc.

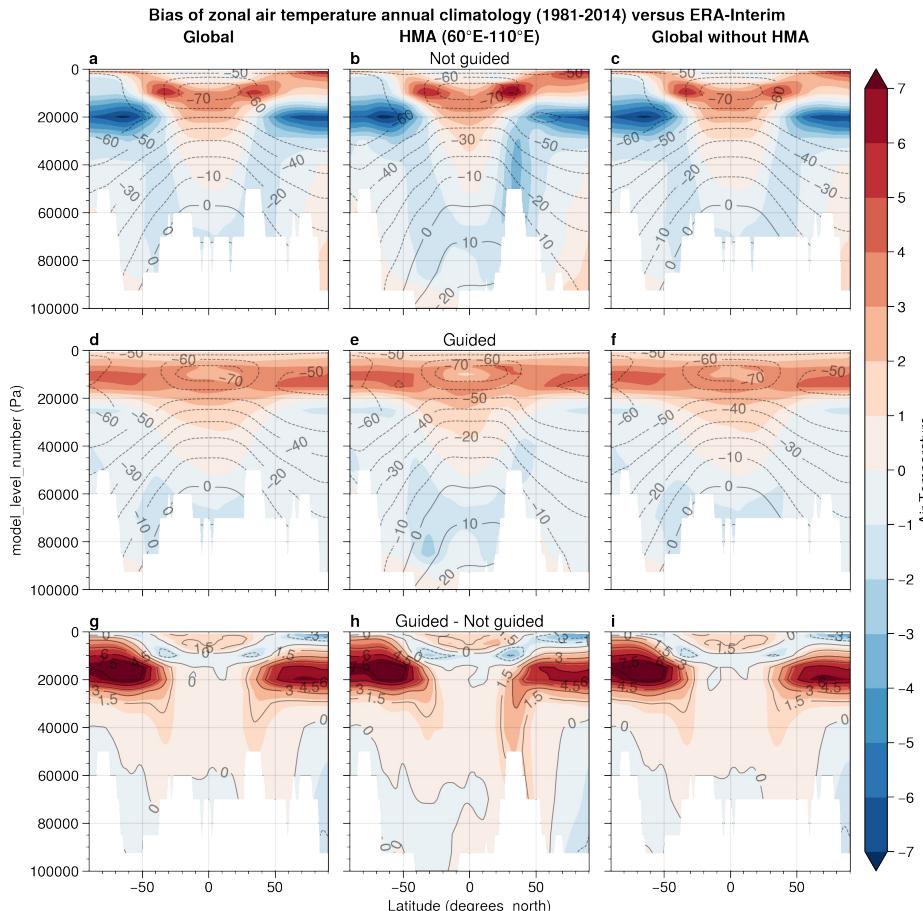
# Link with orography?

Annual climatology: 1981-2014 / Models: IPSL-CM6A-LR (143x142) / Observation: NOAA Climate Data Record (CDR) Version 1



- Some cells stay at **100% of snow cover** all the time!
- Seems **related with elevation**
- No obvious link with the **standard deviation** of elevation... maybe more for higher resolution

# Nudged versus not nudged

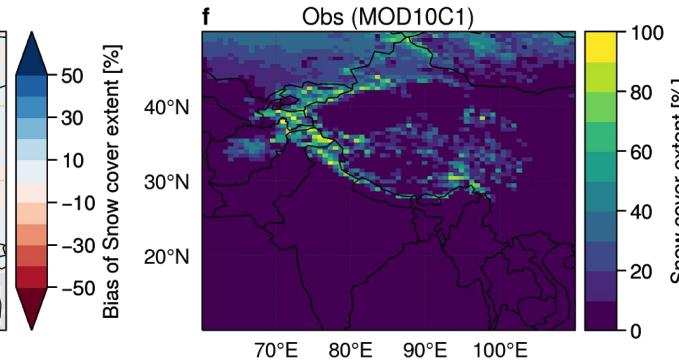
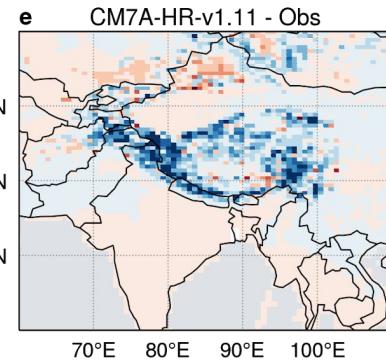
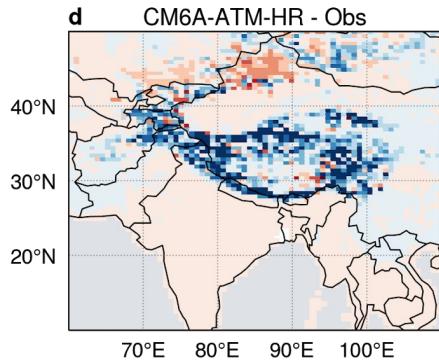
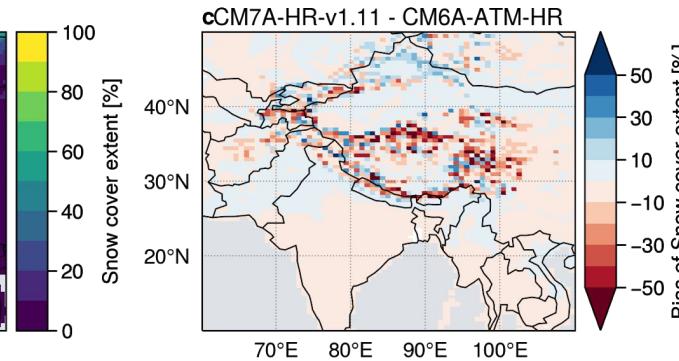
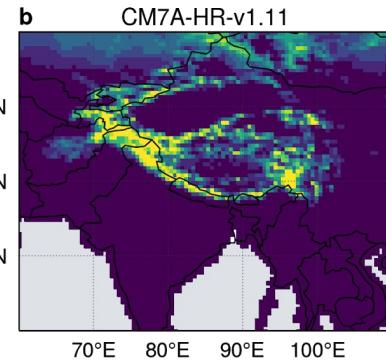
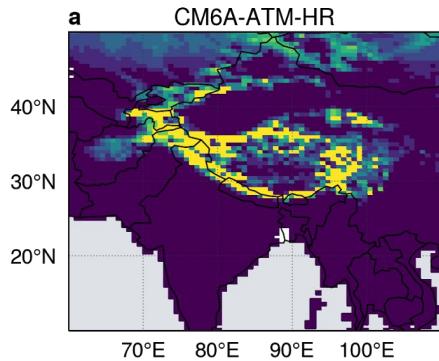


More:

<https://docs.google.com/document/d/1SphVviaGEyB9KObkgC4U2hC-qraRfaE-ojLayZcDGPU/edit?usp=sharing>

# Dynamico

Snow cover extent annual climatology: 2001-2014



More: <https://docs.google.com/document/d/1ClIiEB5U824pH9O3Tshlajc1djttlwfU4reDSbAV4c/edit?usp=sharing>