

Modification of global precipitation data for enhanced hydrologic modeling of tropical montane watersheds

Michael Strauch, Rohini Kumar, Stephanie Eisner, Mark Mulligan, Julia Reinhardt, William Santini, Tobias Vetter, Jan Friesen

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INTERNATIONAL SOIL AND WATER ASSESSMENT TOOL CONFERENCE

SWAT 2017

June 28 – 30 | Warsaw, Poland



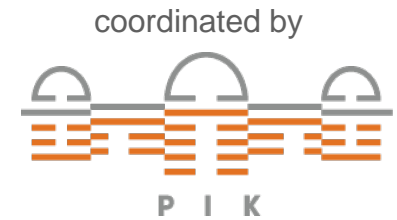
HELMHOLTZ
CENTRE FOR
ENVIRONMENTAL
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SESSION B4:
SWAT REVIEW PAPERS AND
LARGE SCALE APPLICATIONS

MOTIVATION

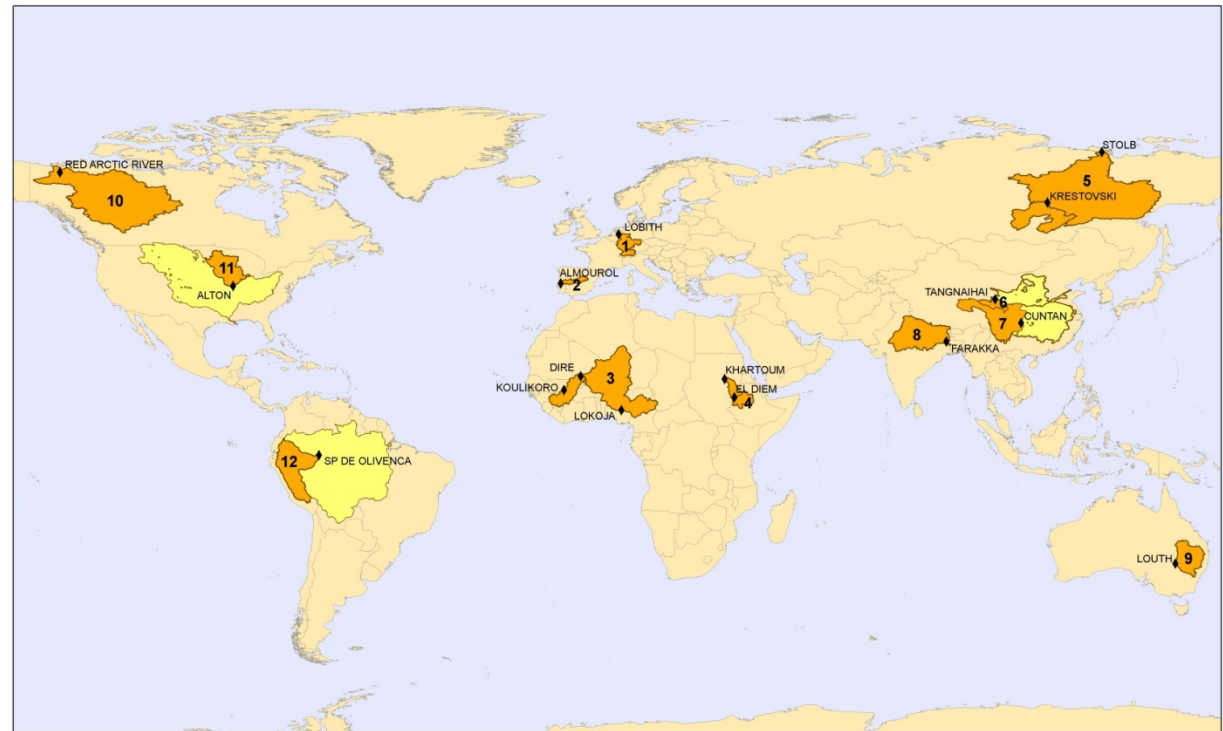
ISI-MIP

Inter-Sectoral Impact Model Integration and Intercomparison Project (Phase 2a)



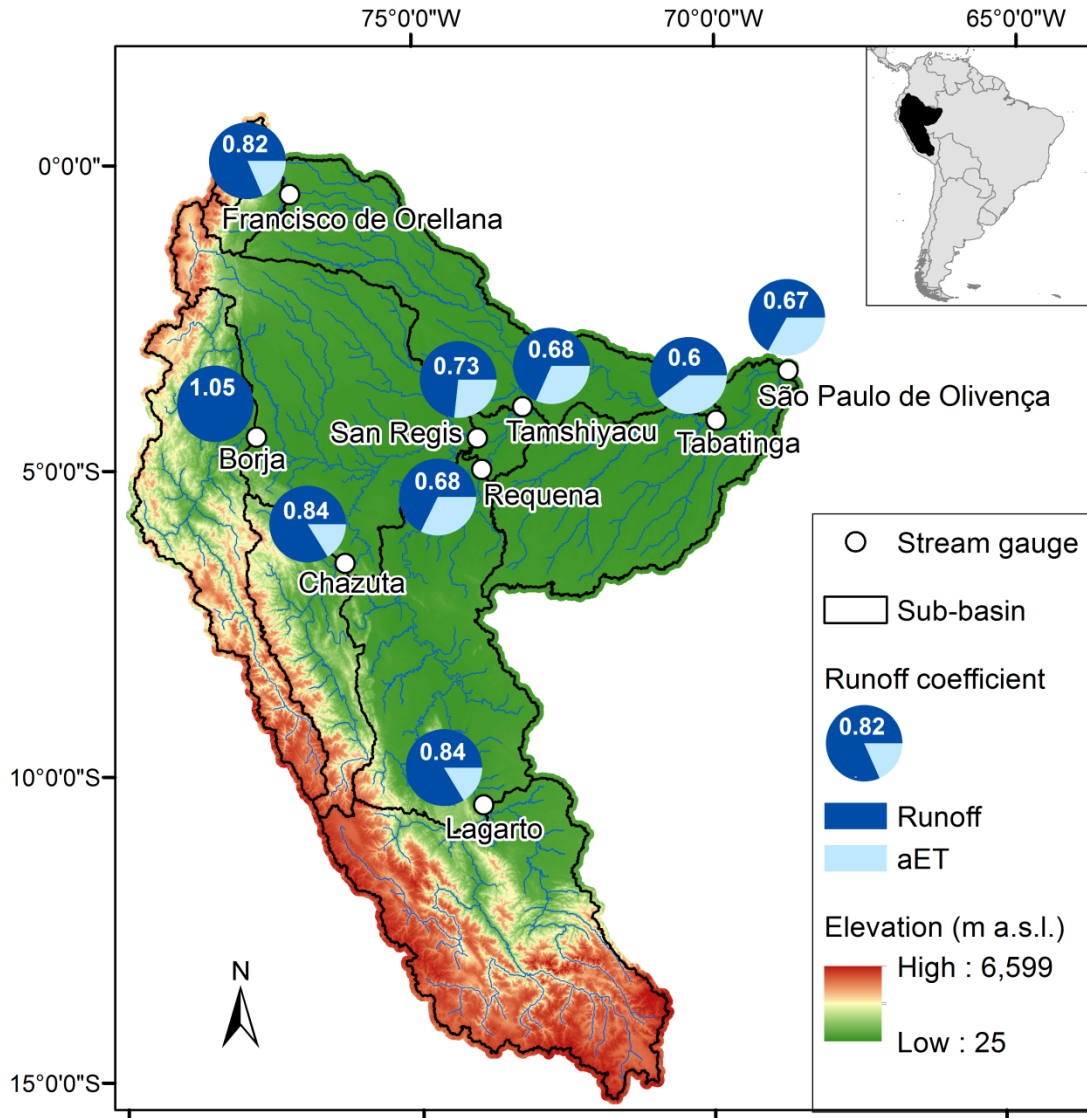
Focus regions for catchment-scale hydrological modelling

- **community-driven** modelling effort
- bringing together **impact models** across sectors and scales
- to create consistent and comprehensive projections of the impacts of **different levels of global warming**



Europe	Africa	Asia	Australia	North America	South America
1. Rhine	3. Niger	5. Lena	7. Upper Yangtze	9. Darling	12. Upper Amazon
2. Tagus	4. Blue Nile	6. Upper Yellow	8. Ganges	10. Mackenzie	11. Upper Mississippi

MOTIVATION



Upper Amazon Basin

- $1.02 \cdot 10^6 \text{ km}^2$
- large elevation range
- Amazonian lowlands: tropical rain forest
- Andean region: montane forests, shrubland, grassland

- unreasonably high runoff coefficients (R / P) for montane subbasins

➤ errors in the data?

R: 5-10% (Filizola et al., 2009)

P: (WFDEI*) huge uncertainty!

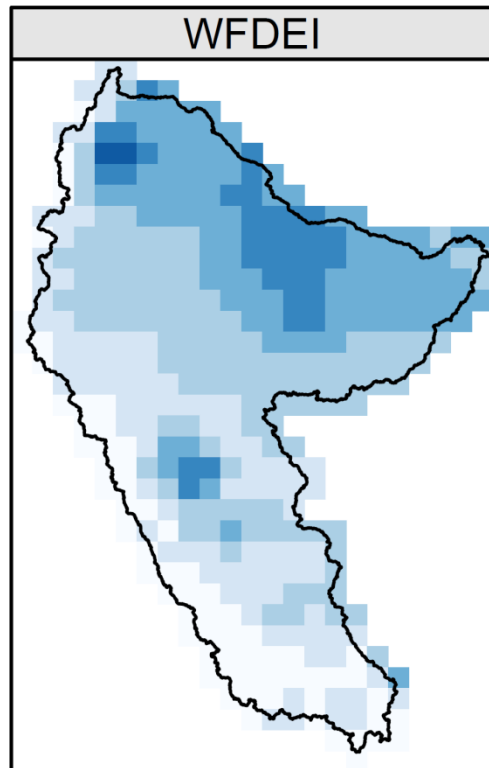
⇒ (1) complex terrain

⇒ (2) cloudwater interception

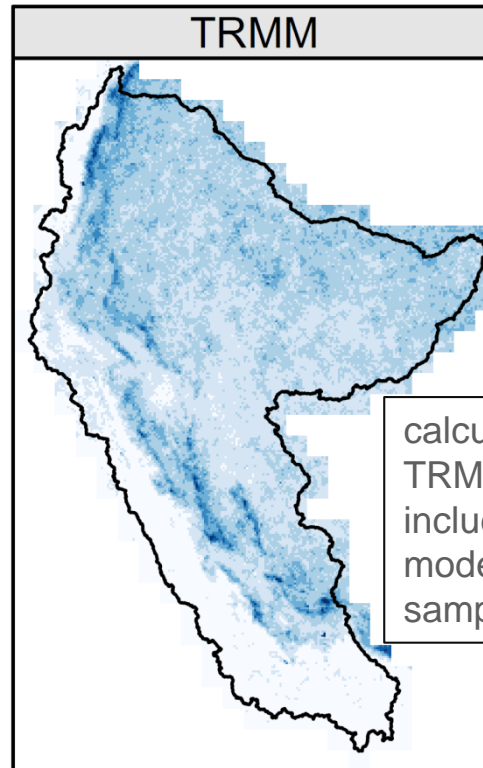
* WFDEI: WATCH Forcing Data methodology applied to ERA-Interim data (Weedon et al., 2014)

Problem 1: Complex terrain

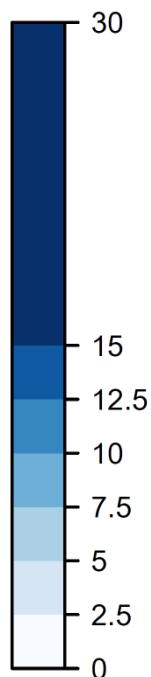
Average daily precipitation (mm)
(1998-2008)



- Weedon et al. (2014)
- global 0.5° grid (used in ISIMIP2)
- daily resolution
- basin-wide annual mean (2132 mm) is close to ground-based HYBAM product (2143 mm)



- Nesbitt and Anders (2009)
- 0.05° grid between 36° N/S
- climatology (only average rates!)
- annual mean too low (1707 mm), but gradients are resolved more reasonably

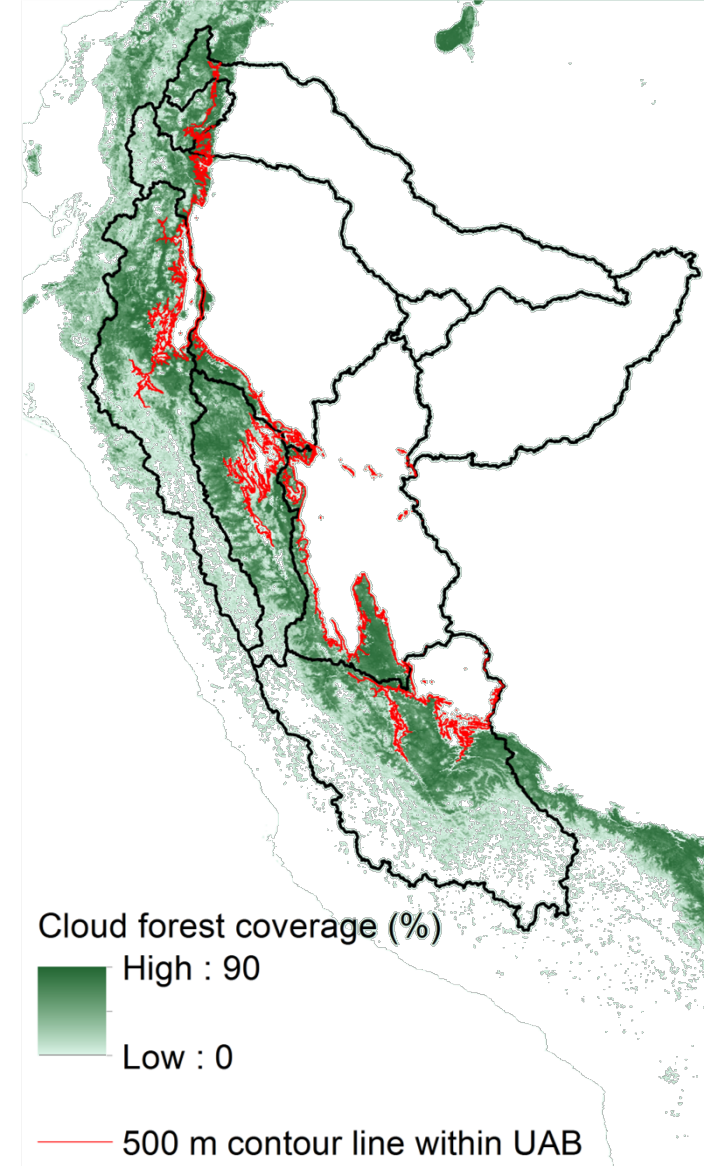


Problem 2: Cloud water interception in tropical montane cloud forests

Cloud water interception (CWI) is an unaccounted source of water

CWI varies strongly and can reach values of more than 1000 mm yr^{-1} (e.g. Bruijnzeel et al., 2011)

Clark et al. (2014) calculated a cloud water contribution of $316 \pm 116 \text{ mm}$ (or $11 \pm 4\%$) to annual streamflow for the Kosñipata catchment in the eastern Peruvian Andes using an isotopic mixing model



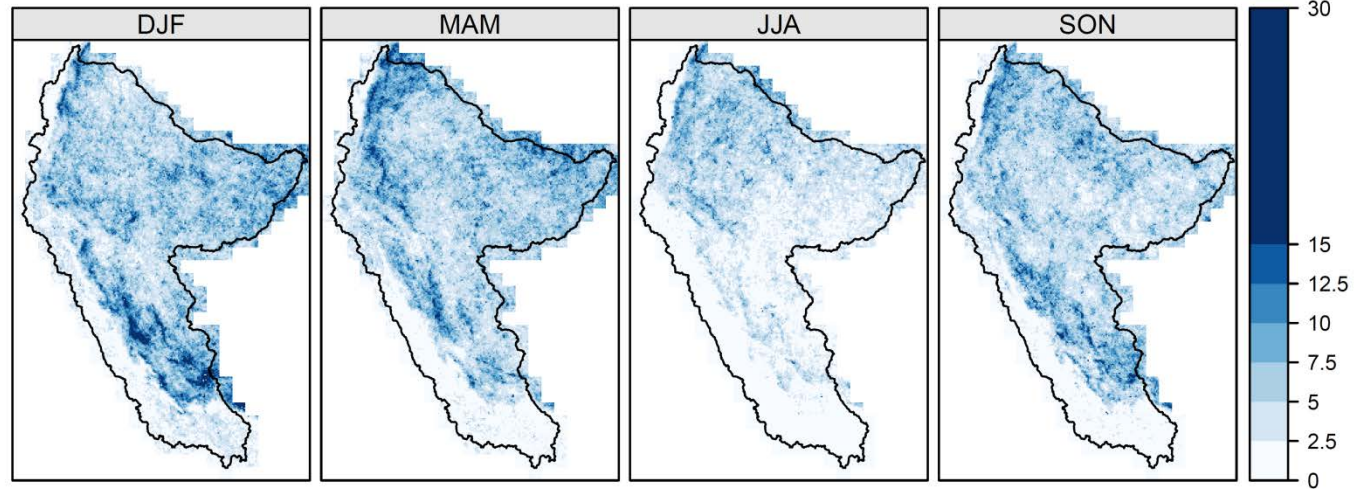
Source: Mulligan (2010)

METHODS

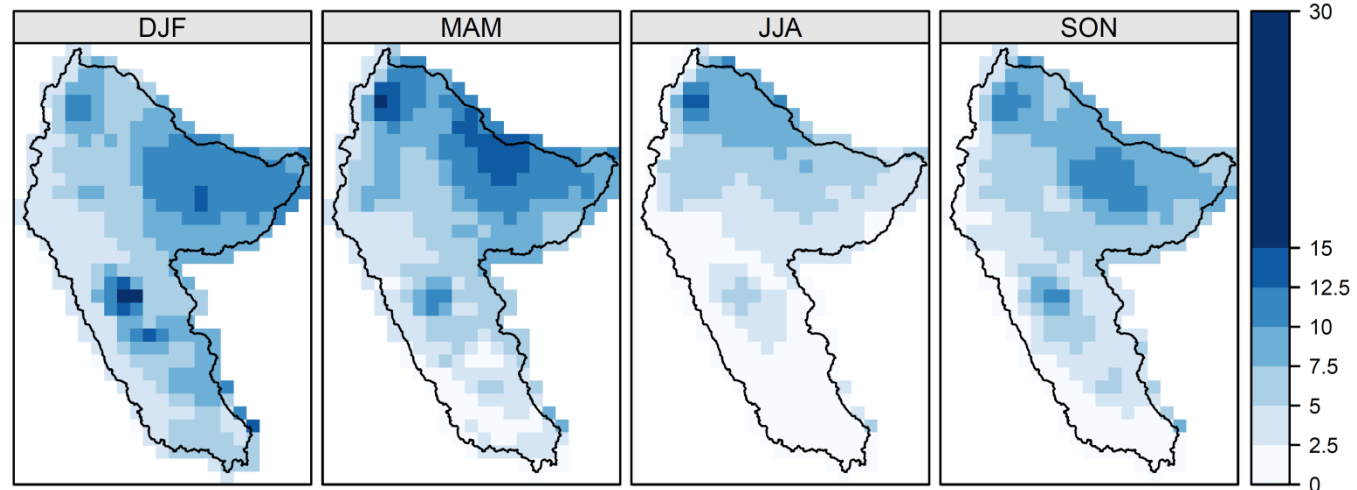
Adjustment of WFDEI data

(1) TRMM correction

TRMM average precipitation rate (mm/day in 1998-2008), 0.05° grid



WFDEI average precipitation rate (mm/day in 1998-2008), 0.5° grid



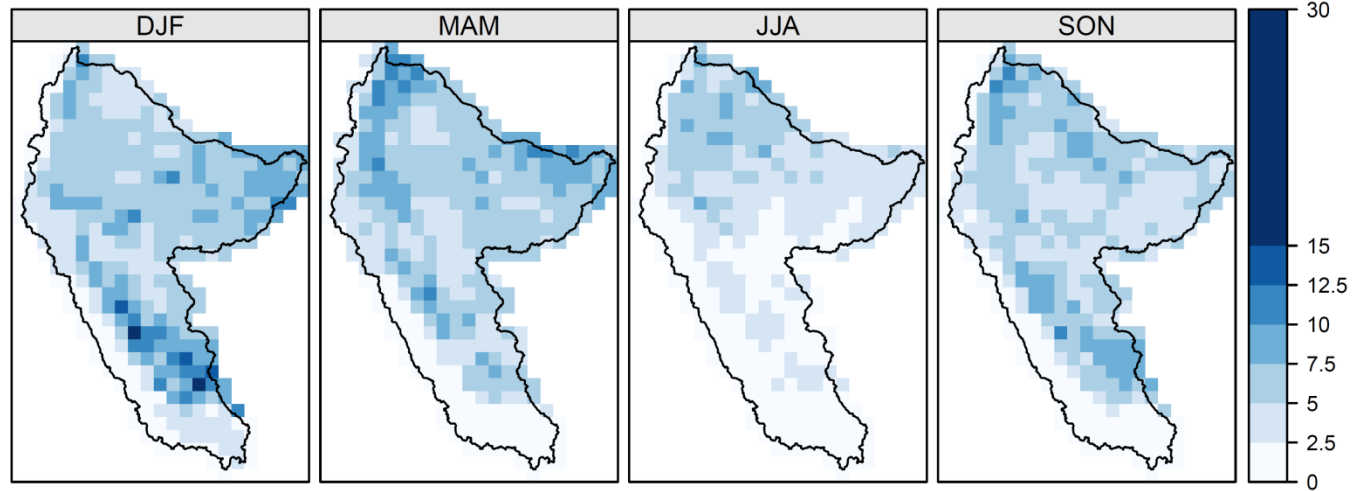
METHODS

Adjustment of WFDEI data

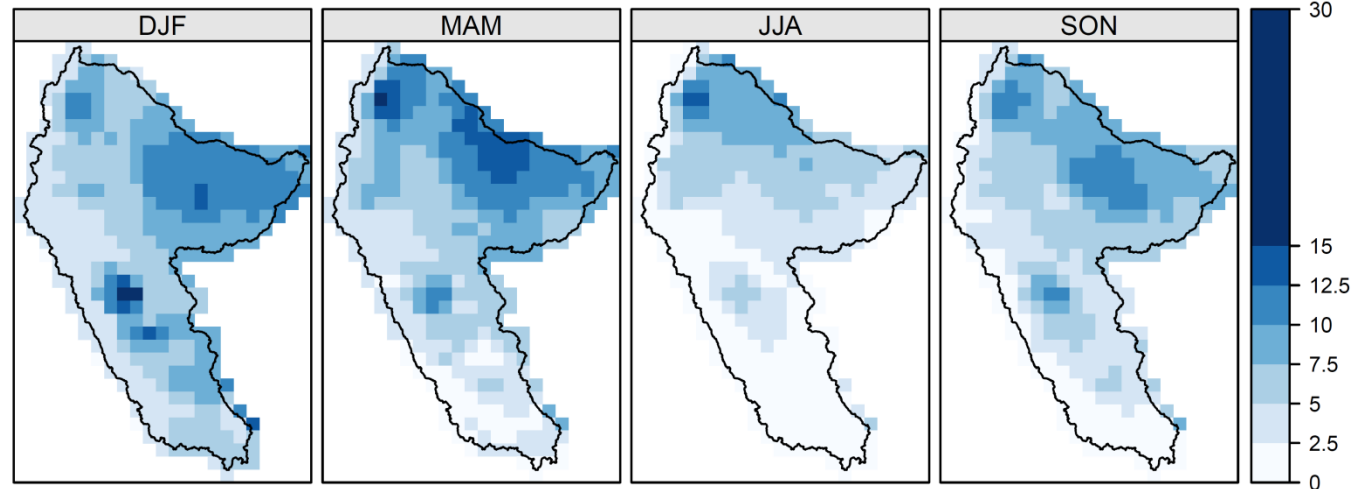
(1) TRMM correction

Step 1:
Aggregate
TRMM to 0.5°

TRMM average precipitation rate (mm/day in 1998-2008), 0.5° grid



WFDEI average precipitation rate (mm/day in 1998-2008), 0.5° grid



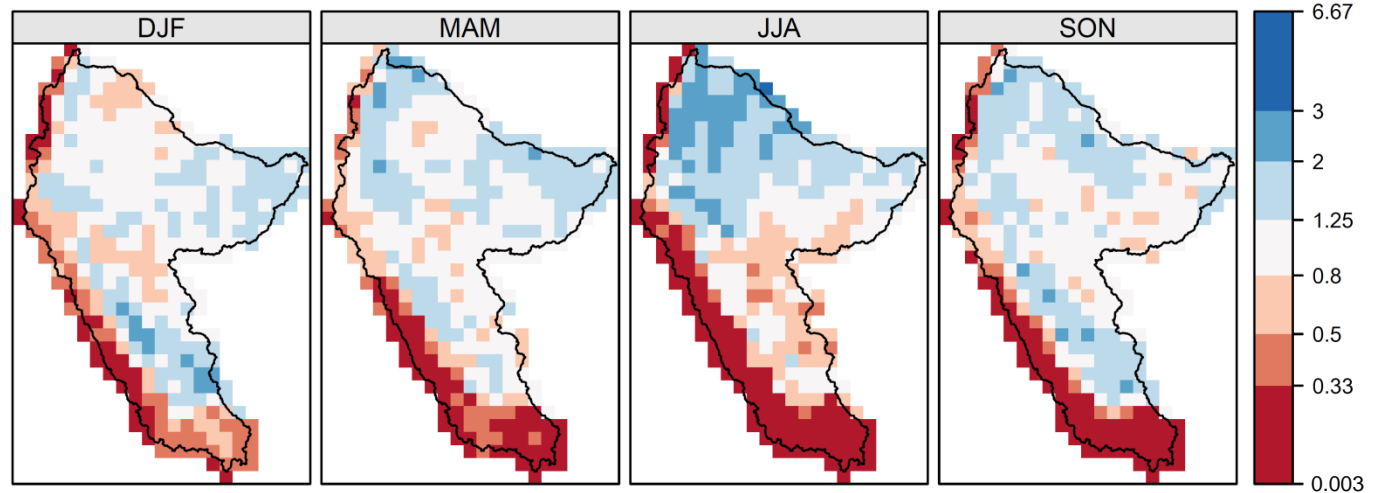
METHODS

Adjustment of WFDEI data

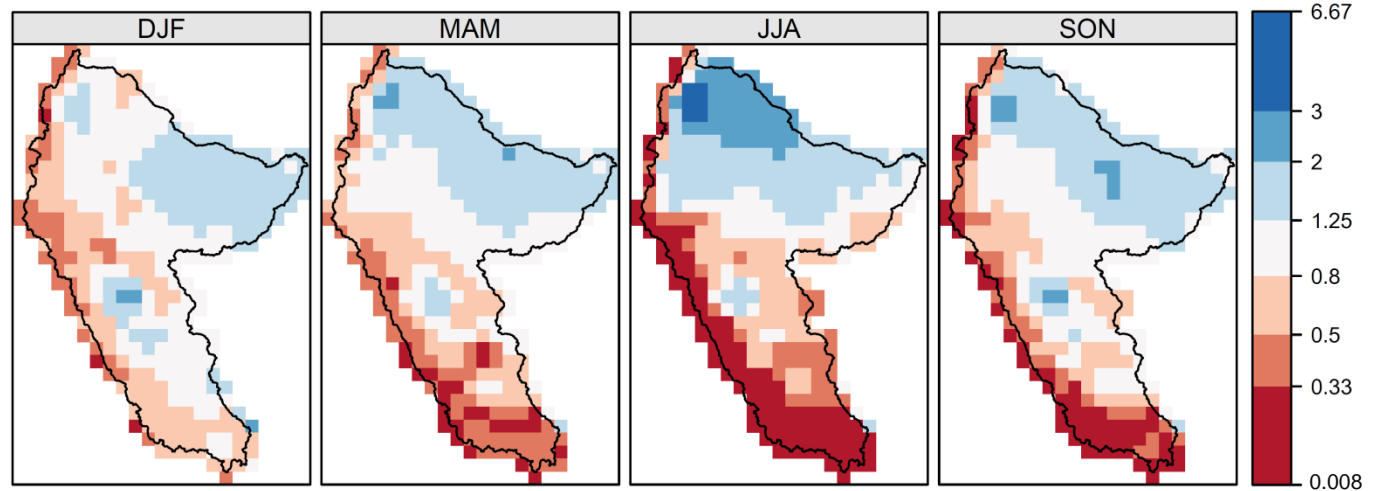
(1) TRMM correction

Step 2:
Divide grid
cell values
by basin
average

TRMM normalized (TRMM_norm)



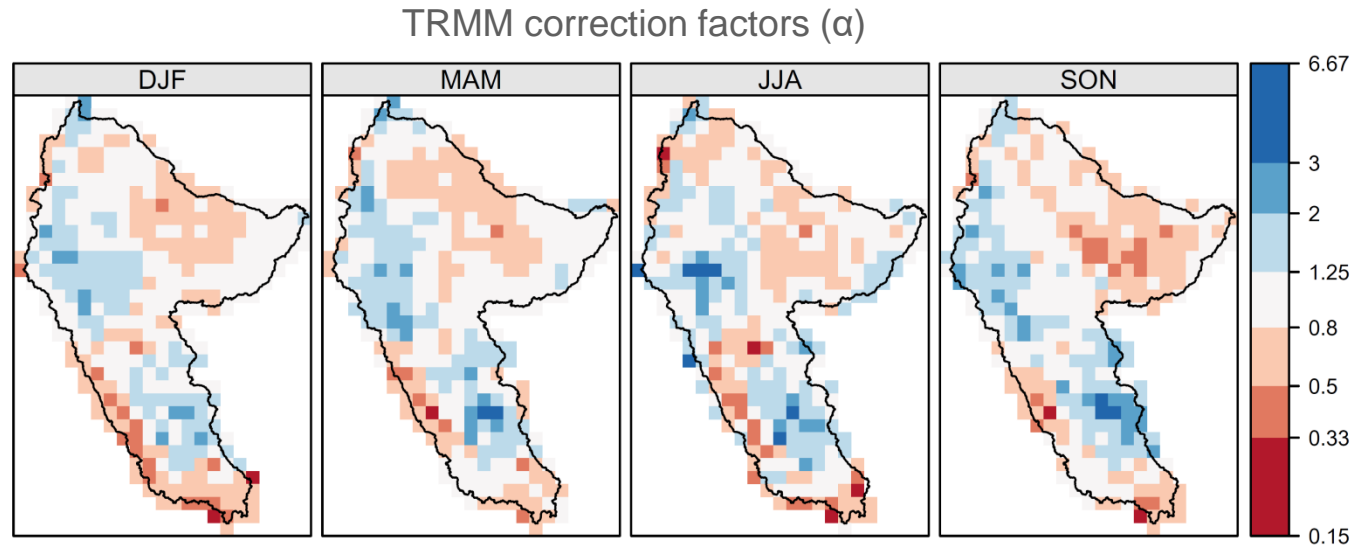
WFDEI normalized (WFDEI_norm)



METHODS

Adjustment of WFDEI data

(1) TRMM correction



Step 3:
$$\alpha_{i,s} = \frac{\text{TRMM_norm}_{i,s}}{\text{WFDEI_norm}_{i,s}}$$

i : individual 0.5° grid cell

s : season

t : day

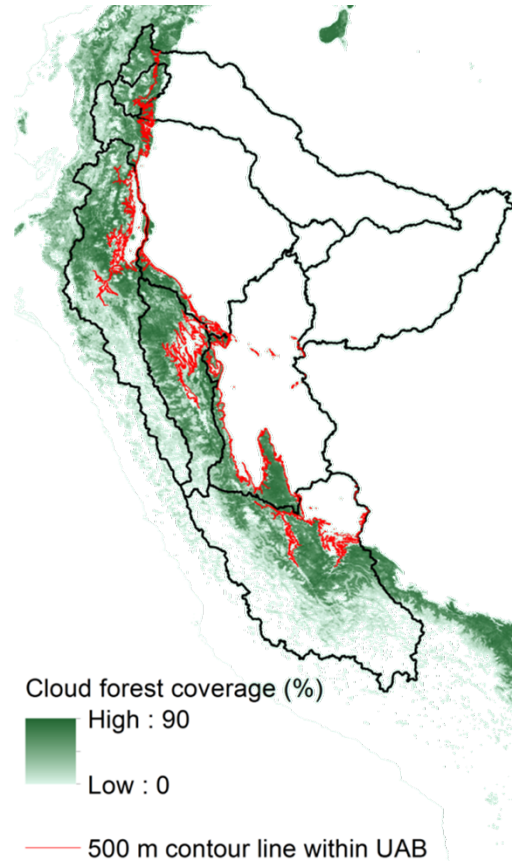
Step 4:
$$\underline{\underline{\text{WFDEI_TRMM}_{i,s,t} = \alpha_{i,s} \text{WFDEI}_{i,s,t}}}}$$

METHODS

Adjustment of WFDEI data

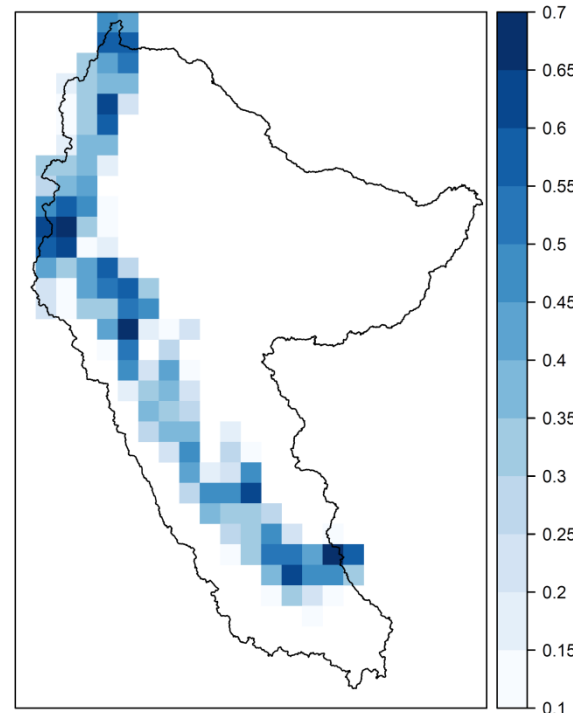
(2) CWI correction

Cloud forest coverage



Source: Mulligan (2010)

CWI correction factor 1: β



$\beta =$ aggregated (0.5°) coverage as fraction between 0 and 1

CWI correction factor 2: $\gamma =$ fraction of CWI on precipitation (constant)

Two scenarios:
 $\gamma = 0.15, \gamma = 0.5$

$$\underline{\underline{WFDEI_CWI_{i,t} = (1 + \gamma \beta_i)WFDEI_{i,t}}}$$

$$\underline{\underline{WFDEI_TRMM_CWI_{i,t} = (1 + \gamma \beta_i)WFDEI_TRMM_{i,t}}}$$

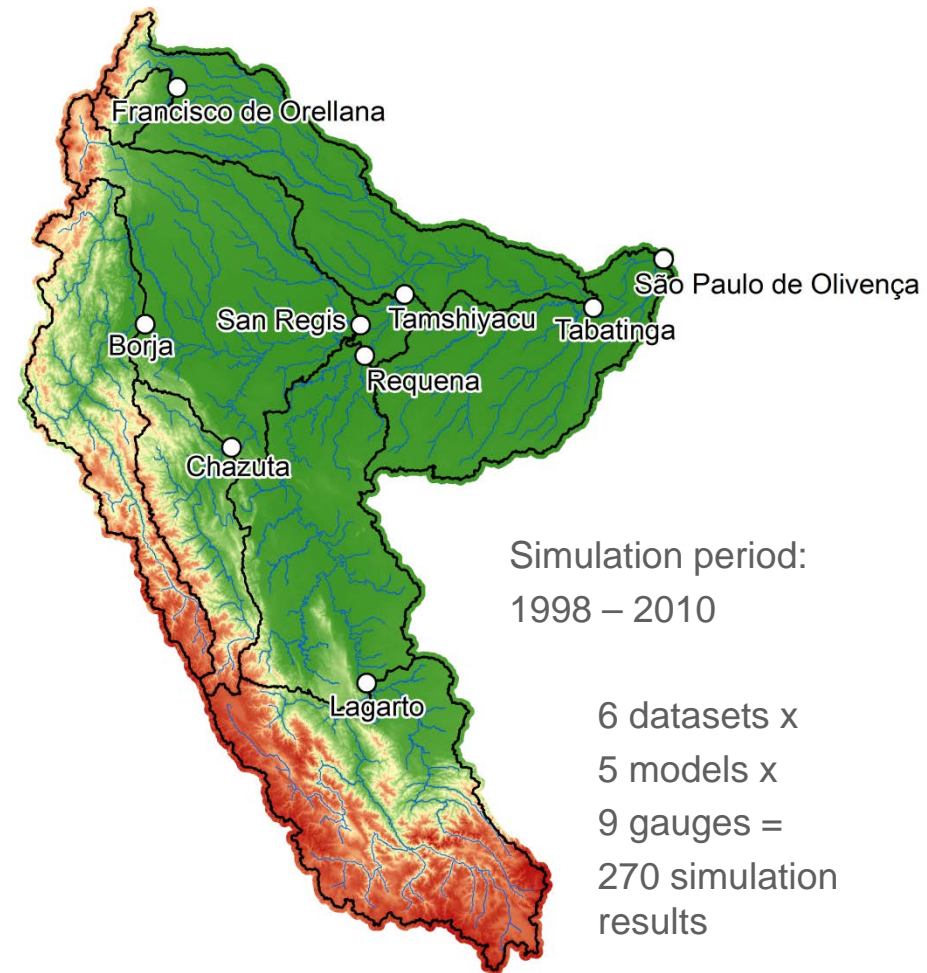
METHODS Test with hydrologic model ensemble

Input precipitation datasets:

- WFDEI
- WFDEI_CWI15
- WFDEI_CWI50
- WFDEI_TRMM
- WFDEI_TRMM_CWI15
- WFDEI_TRMM_CWI50

Hydrologic models (uncalibrated):

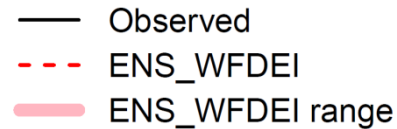
- HBV model (Bergström, 1995)
- mHM (Kumar et al., 2013; Samaniego et al., 2010)
- SWAT (Arnold et al., 1998; modified for tropical plant growth: Strauch and Volk, 2013)
- SWIM (Krysanova et al., 1998)
- WaterGAP3 (Verzano, 2009)



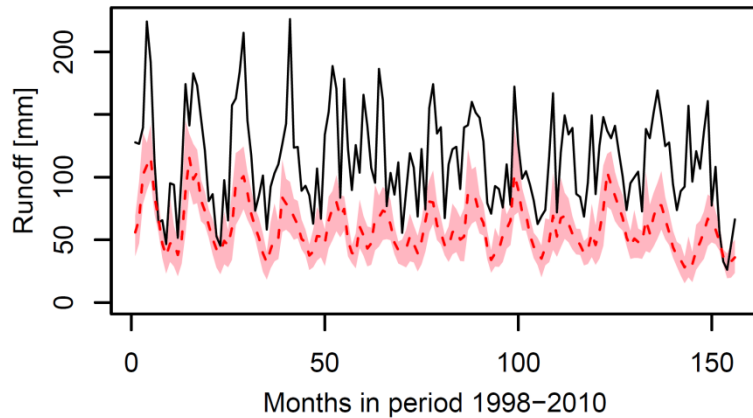
Can we achieve better model performance with adjusted precipitation?

RESULTS

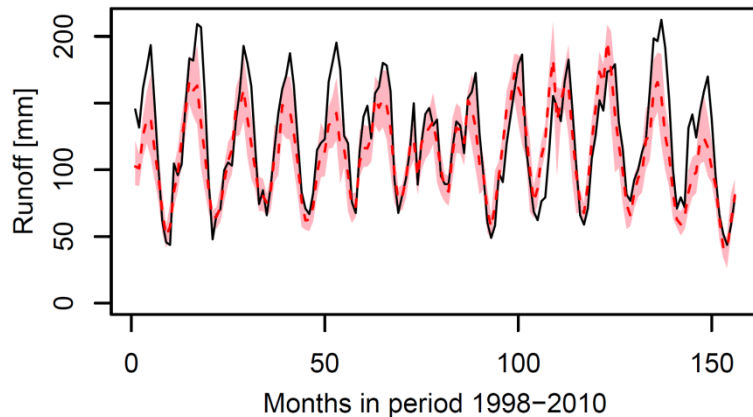
Simulations using WFDEI precipitation



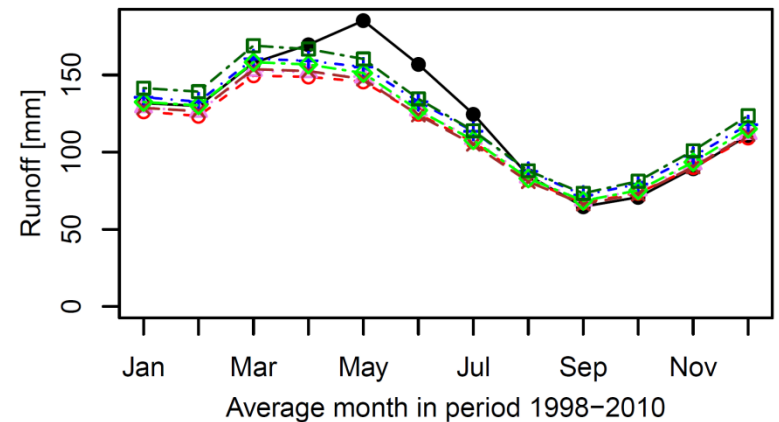
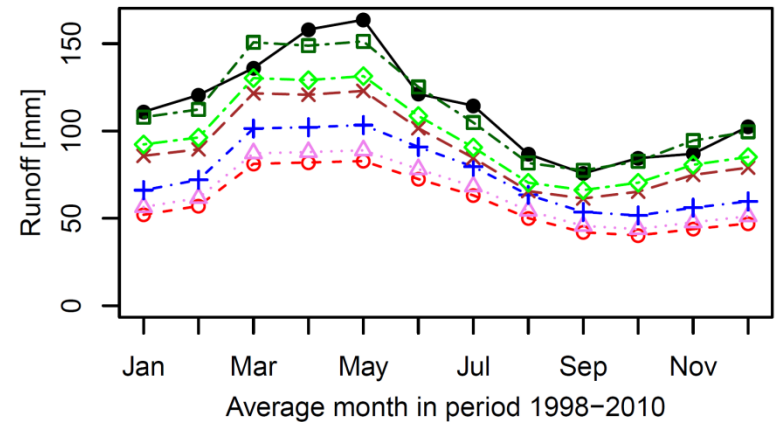
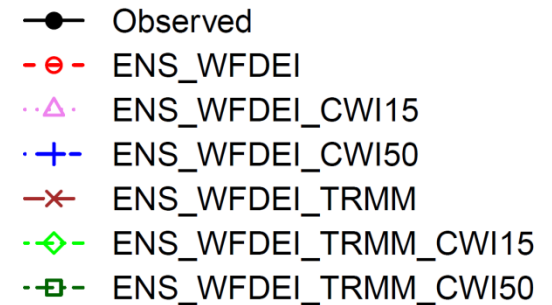
Borja



São Paulo de Olivença

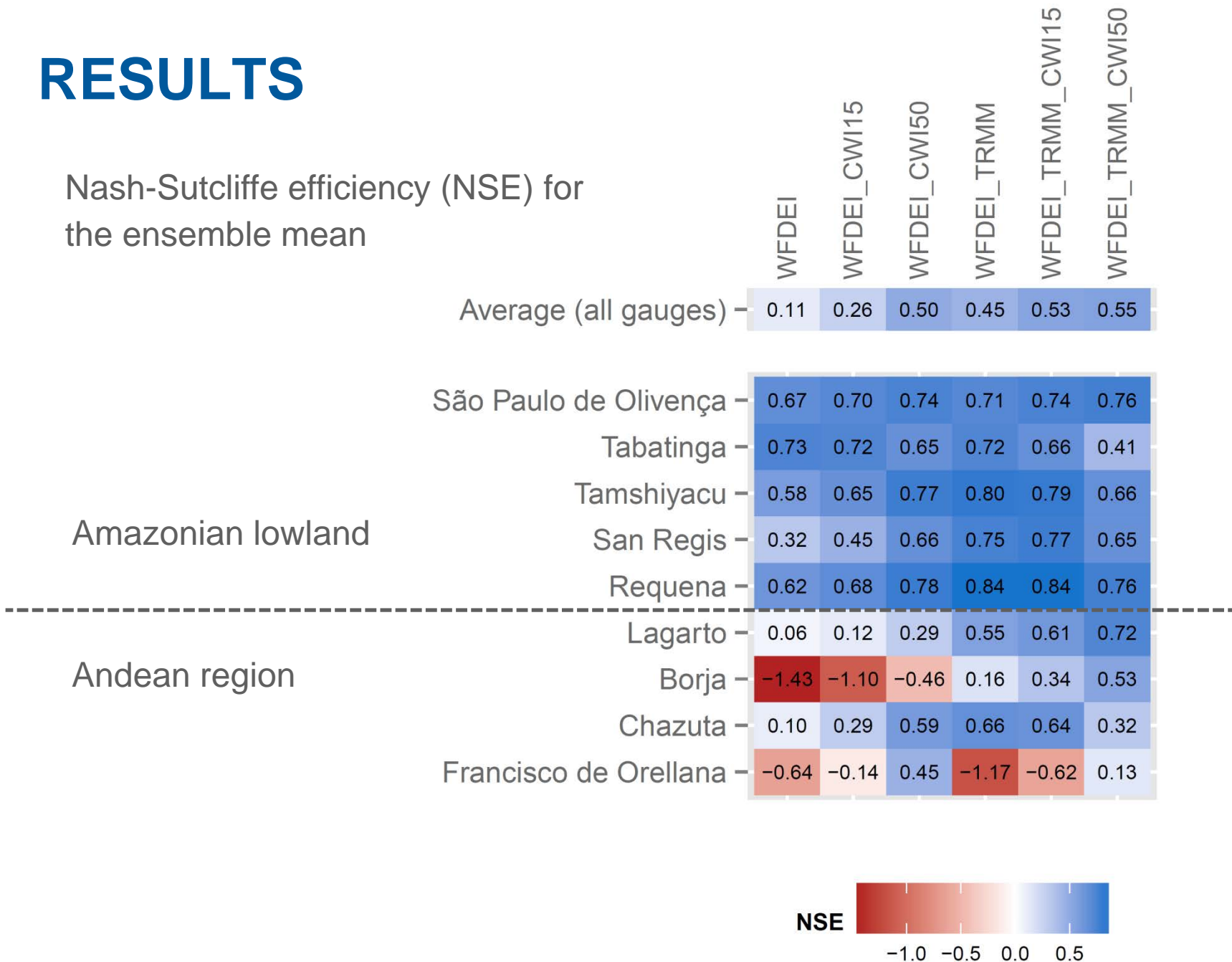


Simulations using adjusted precipitation



RESULTS

Nash-Sutcliffe efficiency (NSE) for the ensemble mean



CONCLUSIONS

Unrealistically high R/P coefficients point to errors in the data

...assuming stationarity of long-term water storages, e.g. glaciers!

Our approach to adjust daily precipitation data...

...is simple but plausible, accounting for complex terrain gradients and/or cloud water interception (but not for temporal dynamics!)

...is based on freely available tropics-wide data

...generally increased model performance in the UAB (but differently across gauges)

...should be transferable to other tropical montane regions



THANK YOU

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Adjustment of global precipitation data for enhanced hydrologic modeling of tropical Andean watersheds

**Michael Strauch¹ · Rohini Kumar² · Stephanie Eisner³ ·
Mark Mulligan⁴ · Julia Reinhardt⁵ · William Santini^{6,7} ·
Tobias Vetter⁵ · Jan Friesen⁸**

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APPENDIX

EQUATIONS

- TRMM corrected precipitation

$$W_{T_{i,s,t}} = \alpha_{i,s} W_{i,s,t} \quad \frac{\bar{T}_{i,s}}{\frac{1}{N} \sum_{i=1}^N \bar{T}_{i,s}} = \alpha_{i,s} \frac{\bar{W}_{i,s}}{\frac{1}{N} \sum_{i=1}^N \bar{W}_{i,s}}$$

- CWI corrected precipitation

$$W'_{i,t} = (1 + \gamma \beta_i) W_{i,t}$$

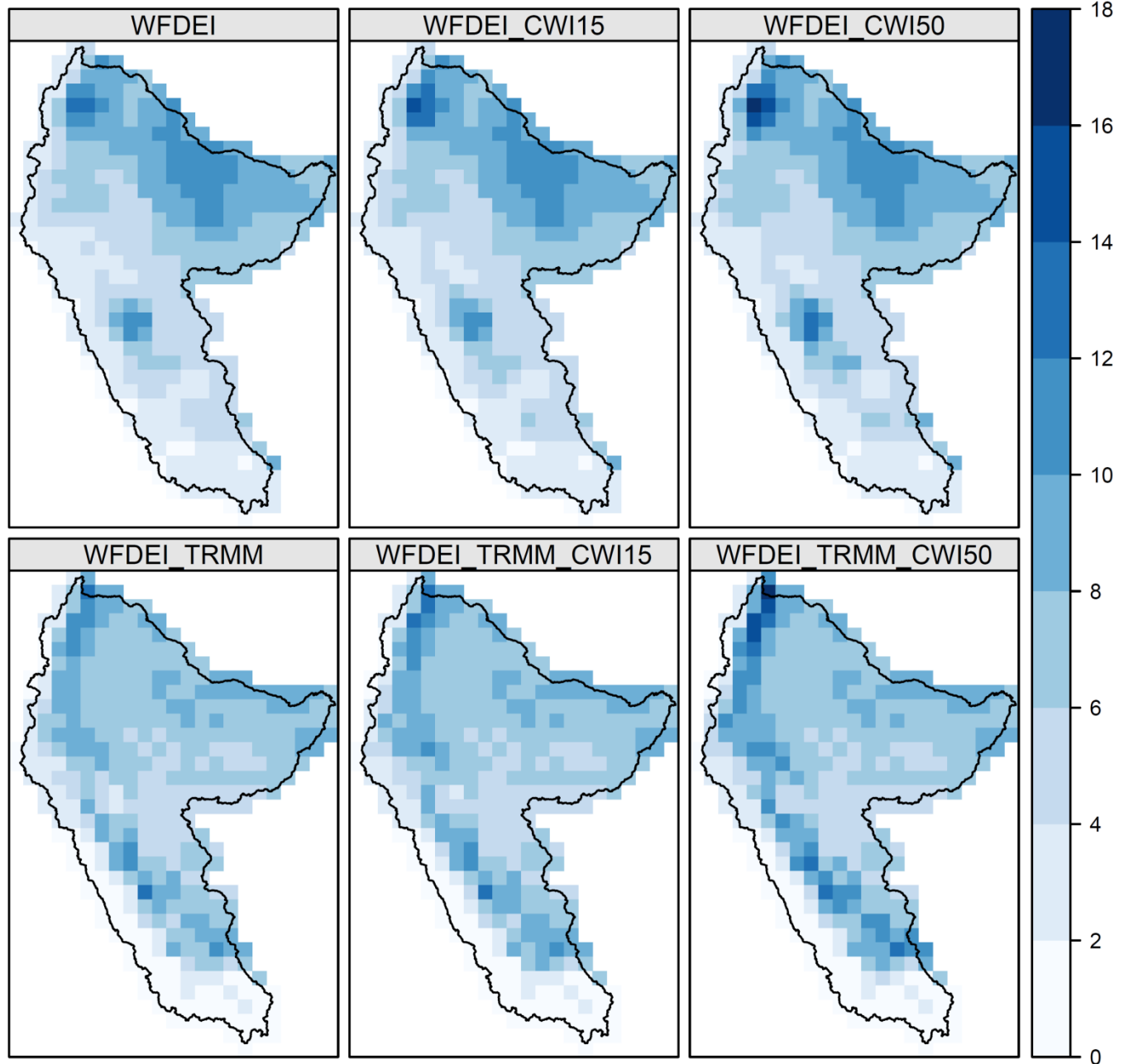
- TRMM and CWI corrected precipitation

$$W'_{T_{i,t}} = (1 + \gamma \beta_i) W_{T_{i,t}}$$

i: individual 0.5° grid cell
s: season (DJF, MAM, JJA, or SON)
t: day
 α : TRMM correction factor
W: WFDEI precipitation
 \bar{T} : average daily precipitation rate (mm) of TRMM
 \bar{W} : average daily precipitation rate (mm) of WFDEI
N: total number of all grid cells in the UAB (405)
 γ : CWI correction factor 2 (CWI fraction on P, 0.15 or 0.5)
 β : CWI correction factor 1 (cloud forest coverage)

APPENDIX

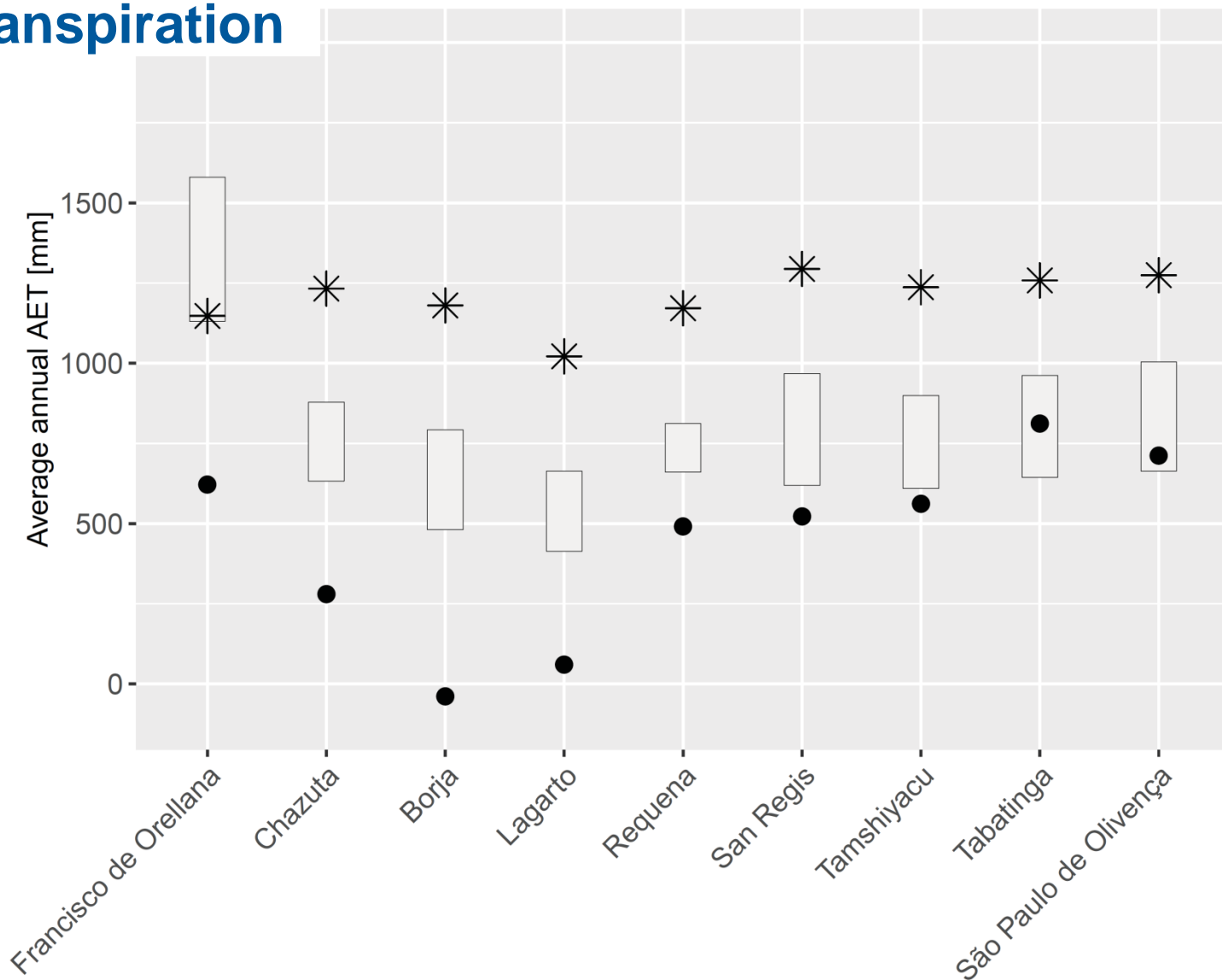
Spatial distribution of adjusted precipitation (mean)



APPENDIX

- * ET_MOD16
- P_WFDEI - Qsim_WFDEI (ensemble range)
- P_WFDEI - Qobs

Evapotranspiration



APPENDIX

* ET_MOD16

□ P_WFDEI_TRMM_CWI50 - Qsim_WFDEI_TRMM_CWI50 (ensemble range)

● P_WFDEI_TRMM_CWI50 - Qobs

Evapotranspiration

