### Hydrology and Water Resources

B-EPICC's hydrology portfolio focuses on the water-food-energy nexus under climate conditions, seeking to work with local stakeholders on modeling and policy development



Carlos Antonio Fernandez-Palomino palomino@pik-potsdam.de

#### B-EPICC hydrology team:



Fred F. Hattermann hattermann@pik-potsdam.de



Valentina Krysanova Valentina krysanova@pik-potsdam.de



Potsdam Institute for Climate Impact Research





Supported by:

IKI O

based on a decision of the German Bundestag

São José dos Campos 2022

### Hydrology WP - Peru

Our main research objective in Peru is to understand the distribution of water budget components at national scale of Peru and its sensitivity to climate change for better water resources management

#### NEW GRIDDED PRECIPITATION DATA FOR PERU

To collect or generate reliable and accurate hydrometeorological dataset, particularly precipitation (Manuscript published in Journal of hydrometeorology)

#### ANALYSIS OF THE DISTRIBUTION OF WATER BUDGET COMPONENTS IN PERUVIAN BASINS

To understand the hydrological processes of Andean-Amazon basins (Manuscript published Hydrological Sciences Journal)

#### PROJECTED CHANGES IN WATER BUDGET COMPONENTS

To assess the climate change impact on water resources in Peruvian river basins (Manuscript in preparation)



### Generation of a Gridded Precipitation Product for Peru and Ecuador (<u>RAIN4PE</u>) and Application in the Hydrological Modeling of Peruvian Catchments including the Upper Amazon River Basin

**Carlos Antonio Fernandez-Palomino** (palomino@pik-potsdam.de, cafpxl@gmail.com)<sup>1,2</sup>, Fred F. Hattermann<sup>1</sup>, Valentina Krysanova<sup>1</sup>, Anastasia Lobanova<sup>1</sup>, Fiorella Vega-Jácome<sup>3</sup>, Waldo Lavado<sup>3</sup>, William Santini<sup>4</sup>, Cesar Aybar<sup>5</sup>, and Axel Bronstert<sup>2</sup> <sup>1</sup> Potsdam Institute for Climate Impact Research, <sup>2</sup> University of Potsdam, <sup>3</sup> Servicio Nacional de Meteorología e Hidrología del Perú, <sup>4</sup> Institut de Recherche pour le Développement, <sup>5</sup> University of Salzburg

**RAIN4PE** (Rain for Peru and Ecuador) is the only gridded precipitation dataset for Peru and Ecuador that benefits from observed precipitation, estimated precipitation (satellite and re-analysis) and elevation data, and is supplemented by streamflow data to estimate total precipitation in basins with important contribution of cloud/fog water. RAIN4PE is available at daily resolution and ~10 km for the period 1981-2015





OTSDAM INSTITUTE FOR Climate Impact Research





 to generate a high-spatial-resolution and hydrologically adjusted precipitation dataset called RAIN4PE (Rain for Peru and Ecuador), and

2) to evaluate the applicability of RAIN4PE and the current state-ofthe-art precipitation products (ERA5, CHIRP, CHIRPS, MSWEP, and PISCO) for hydrological modeling of Peruvian and Ecuadorian watersheds.

### Overview: precipitation measurement and precipitation datasets

#### **@AGU**PUBLICATIONS

#### **Reviews of Geophysics**

**REVIEW ARTICLE** 10.1002/2017 RG000 574

conduct a comprehensive review

'ey Points:

A Review of Global Precipitation Data Sets: Data Sources, Estimation, and Intercomparisons

Qiaohong Sun<sup>1</sup>, Chiyuan Miao<sup>1</sup> (<sup>1</sup>), Qingyun Duan<sup>1</sup> (<sup>1</sup>), Hamed Ashouri<sup>2</sup> (<sup>1</sup>), Soroosh Sorooshian<sup>2</sup> (<sup>1</sup>), and Kuo-Lin Hsu<sup>2</sup>



Motivation: Poor performance of hydrological model using different precipitation (P) datasets in the upper Amazon River Basin



Zubieta, R., A. Getirana, J. C. Espinoza, and W. Lavado, 2015: Impacts of satellite-based precipitation datasets on rainfall–runoff modeling of the Western Amazon basin of Peru and Ecuador. J. Hydrol., 528, 599–612, https://doi.org/10.1016/j.jhydrol.2015.06.064.

### Consideration : importance of cloud/fog water input into the system in the generation of precipitation dataset

Contribution of cloud/fog water into the system

Α

Páramo

### B3. . $\odot$ $\odot$ Montane cloud forest zone Subalpine cloud forest or mixed zone Montane forest Páramo or other vegetation zone

### Hydrological

RESEARCH ARTICLE

Contribution of occult precipitation to the water balance of páramo ecosystems in the Colombian Andes

Maria Fernanda Cárdenas 🐹, Conrado Tobón, Wouter Buytaert

Forest Ecology and Management Volume 255, Issues 3-4, 20 March 2008, Pages 1315-1325



Rainfall and cloud-water interception in tropical montane forests in the eastern Andes of Central Peru

Daniel Gomez-Peralta <sup>a</sup> 🎗 🖾, Steven F. Oberbauer <sup>a, b</sup>, Michael E. McClain <sup>c</sup>, Thomas E. Philippi <sup>a</sup>

Hydrol. Earth Syst. Sci., 18, 5377-5397, 2014 www.hydrol-earth-syst-sci.net/18/5377/2014/ doi:10.5194/hess-18-5377-2014 C Author(s) 2014. CC Attribution 3.0 License. Hydrology and Earth System Sciences

#### The hydrological regime of a forested tropical Andean catchment

K. E. Clark<sup>1,\*</sup>, M. A. Torres<sup>2</sup>, A. J. West<sup>2</sup>, R. G. Hilton<sup>3</sup>, M. New<sup>1,4</sup>, A. B. Horwath<sup>5</sup>, J. B. Fisher<sup>6</sup>, J. M. Rapp<sup>7,\*\*</sup>, A. Robles Caceres8, and Y. Malhi

> 0-30% of total precipitation (Liquid precipitation + cloud/fog water)

Helmer et al. 2019

### Hydrological implications when cloud water is misrepresented in precipitation products in the upper Amazon River basin



**Fig. 1** a Elevation map of the UAB including stream gauges and their runoff coefficients based on WFDEI precipitation and observed runoff (AET = actual evapotranspiration after water balance closure); **b** distribution of significantly cloud affected forests (source: Mulligan 2010)



How to estimate total precipitation in regions with scarce data and water budget imbalance?

### **JGR** Atmospheres

Research Article 🛛 🙃 Free Access

Soil as a natural rain gauge: Estimating global rainfall from satellite soil moisture data

Luca Brocca 🔀, Luca Ciabatta, Christian Massari, Tommaso Moramarco, Sebastian Hahn, Stefan Hasenauer, Richard Kidd, Wouter Dorigo, Wolfgang Wagner, Vincenzo Levizzani







Journal of Hydrology Volume 556, January 2018, Pages 993-1012



Research papers

Spatiotemporal patterns of precipitation inferred from streamflow observations across the Sierra Nevada mountain range

Brian Henn <sup>a</sup> A ⊠, Martyn P. Clark <sup>b</sup> ⊠, Dmitri Kavetski <sup>c</sup> ⊠, Andrew J. Newman <sup>b</sup> ⊠, Mimi Hughes <sup>d, e</sup> ⊠, Bruce McGurk <sup>f</sup>⊠, Jessica D. Lundquist <sup>g</sup> ⊠

#### Precipitation



#### Streamflow

### Study area and data



Precipitation gauges (804)

streamflow stations (72)

## Data for the precipitation estimation

#### Precipitation sources

- ✓ Gauge-based precipitation
- ✓ Satellite-based precipitation (CHIRP dataset)
- ✓ Reanalysis-based precipitation (ERA5 dataset)
- **D** Elevation
- □ Streamflow

Red polygons show the gauged catchments with water budget imbalance where gridded precipitation datasets are corrected using streamflow data through reverse hydrology: Nueva Loja station gauges the catchment "A", San Sebastian (B), Francisco De Orellana (C), Santiago (D), Borja (E), Shanao (F), Chazuta (G), Puerto Inca (H), Lagarto (I).

### Methodology



- Here "d" ("m") indicates the daily (monthly) time step
- BDi,..n are buffer distances (distance from any point to all precipitation gauges)
- SWAT is the Soil and Water Assessment Tool
- BCF is the bias correction factor
- **OFs** are the objective functions for hydrological model calibration (log NSE y FDC signatures)
- **BCF** is optimized only over catchments with water budget imbalance
- Optimization algorithm: **Borg MOEA**
- GOFs are the goodness of fit measures

HYDROLOGICAL SCIENCES JOURNAL

https://doi.org/10.1080/02626667.2020.1846740

Model calibration is based on our previous study:



() Check for updates

Towards a more consistent eco-hydrological modelling through multi-objective calibration: a case study in the Andean Vilcanota River basin, Peru

Carlos Antonio Fernandez-Palomino (10<sup>a,b</sup>, Fred F. Hattermann<sup>a</sup>, Valentina Krysanova<sup>a</sup>, Fiorella Vega-Jácome (10<sup>c</sup> and Axel Bronstert (10<sup>b,d</sup>

-Research Department II – Climate Resilience, Potsdam Institute for Climate Impact Research, Potsdam, Germany; <sup>a</sup>Institute of Environmental Science and Geography, University of Potsdam, Potsdam, Germany; <sup>a</sup>Hidrologia – Estudios e Investigaciones Hidrologias, Servicio Nacional de Meteorologia e Hidrologia del Perú, LIMA, Peru; <sup>a</sup>Water Science Group, Potsdam Institute for Climate Impact Research, Potsdam, Germany

### Results: spatial patterns of precipitation



#### Which precipitation datasets are reliable?

Comparison of precipitation datasets using gauge observations at monthly scale for 1981-2015



Which precipitation products are reliable for hydrological modeling using the Soil and Water Assessment Tool (SWAT) model?

Hydrological model performance for monthly streamflow simulation (1983-2015) using six precipitation datasets Nash–Sutcliffe efficiency Worse Best ERA5 CHIRP CHIRPS **MSWEP** PISCO RAIN4PE NSE Unsatisfactory Satisfactory NSE < 0 0.00 0.25 0.50 0.75 1.00 Median NSE: 0.53 0.68 0.64 0.67 0.82 96 **PBIAS** values between -10 to 10 Percent bias PBIAS [%] shown in green points indicate good model performance in achieving the water budget closure Median |PBIAS|: 162.9 14.8 10.05.4 -15 to -10 -10 to 10 25 to Inf -25 to -15 10 to 15 15 to 25 -Inf to -25

Why do most of the precipitation datasets show unsatisfactory performance for streamflow simulation of Ecuadorian basins?



### RAIN4PE data availability

✓ Daily precipitation data in NetCDF format can be downloaded from <u>https://doi.org/10.5880/pik.2020.010</u>

P I K	Impressu IPACT RESEARCH
Dataset	Rain for Peru and Ecuador (RAIN4PE)
Cite as: Fernandez-Palomino, Carlos Antonio; Hattermann, Fre Cesar; Bronstert, Axel (2021): Rain for Peru and Ecua	Copy citation to clipboard d F.; Krysanova, Valentina; Lobanova, Anastasia; Vega-Jácome, Fiorella; Lavado, Waldo; Santini, William; Aybar, dor (RAIN4PE). V. 1.0. GFZ Data Services. https://doi.org/10.5880/pik.2020.010
Files Download data and description License: CC BY 4.0	Abstract RAIN4PE is a novel daily gridded precipitation dataset obtained by merging multi-source precipitation data (satellite-based Climate Hazards Group InfraRed Precipitation, CHIRP (Funk et al. 2015), reanalysis ERA5 (Hersbach et al. 2020), and ground-based precipitation) with terrain elevation using the random forest regression method. Furthermore, RAIN4PE is hydrologically corrected using streamflow data in catchments with precipitation underestimation through reverse hydrology. Hence, RAIN4PE is the only gridded precipita- tion product for Peru and Ecuador, which benefits from maximum available in-situ observations, multiple pre-
Dataset Description	cipitation sources, elevation data, and is supplemented by streamflow data to correct the precipitation under- estimation over paramos and montane catchments.
Supplement to	The RAIN4PE data are available for the terrestrial land surface between 19°S-2°N and 82-67°W, at 0.1° spa- tial and daily temporal resolution from 1981 to 2015. The precipitation dataset is provided in netCDF format.
Fernandez-Palomino, C. A.; Hattermann, F. F.; Krysanova, V.; Lobanova, A.; Vega-Jácome, F.; Lavado, W.; Santini, W.; Aybar, C.; Bronstert, A. (2021). A novel high-resolution gridded precipita- tion dataset for Peruvian and Ecuadorian water- sheds – development and hydrological evaluation. <i>Journal of Hydrometeorology</i> . https://doi.org/10.11 75/jhm-d-20-0285.1	For a detailed description of the RAIN4PE development and evaluation of RAIN4PE applicability for hydrolo- gical modeling of Peruvian and Ecuadorian watersheds, readers are advised to read Fernandez-Palomino et al. (2021). Additional Information Acknowledgements The authors thank the East Africa Peru India Climate Capacities (EPICC) Project for funding this research within the International Climate Initiative (IKI) funded by the German Federal Ministry for the Environment, Nature Conservation and Nuclear Safety (BMU).

 The data is also available to download using the Google Earth Engine platform from <u>awesome-</u> <u>gee-community-datasets</u>



<sup>8</sup>A Novel High-Resolution Gridded Precipitation Dataset for Peruvian and Ecuadorian Watersheds: Development and Hydrological Evaluation

Journal

### Conclusions

- ✓ Our precipitation product RAIN4PE resulted to be more reliable and accurate for the hydrological modeling of Peruvian and Ecuadorian watersheds compared to other precipitation products such as ERA5, CHIRP, CHIRPS, MSWEP, and PISCO.
- ✓ RAIN4PE can be used for multiple hydro-meteorological applications:
  - Water budget
  - Spatio-temporal analysis of droughts and floods, etc.
- ✓ The approach used for the generation of RAIN4PE can be used in other data-scarce regions. E.g. for amazon basin or south America



### Spatial variability of the water budget components (1985-2015)

• Hydrological model: SWAT driven by RAIN4PE precipitation data



which is a big step and will benefit the water resources management

#### Projected spatiotemporal changes in water budget components under climate change

#### Precipitation

Ref. period: 1985-2015



Period: 2005-2035

%) 50 25 0 -25 -50

> ↓precipitation over lowlands (specially over the southern lowland)

↑precipitation along the Peruvian Andes



The maps show the ensemble median values of the climatological percent changes for precipitation under SSP1-2.6 and SSP5-8.5 compared to the historical period (1985–2015)

#### Projected spatiotemporal changes in water budget components under climate change

#### **Evapotranspiration**



Period: 2005-2035

#### Ref. period: 1985-2015



The maps show the ensemble median values of the climatological percent changes for evapotranspiration under SSP1-2.6 and SSP5-8.5 compared to the historical period (1985–2015)

No changes in evapotranspiration over Andean basins

50 25 0 -25 -50

 $\uparrow$ evapotranspiration over the lowland and arid coastal areas

#### Projected spatiotemporal changes in water budget components under climate change

#### Water yield

Ref. period: 1985-2015

mm

4948

2000

500



Period: 2005-2035

 $\downarrow$  water yield over lowlands (specially over the southern lowland)

50 25 0 -25 -50

> $\uparrow$  water yield along the Andean basins

The maps show the ensemble median values of the climatological percent changes for water yield under SSP1-2.6 and SSP5-8.5 compared to the historical period (1985–2015)

#### **Planned activities for Brazil**

- Generation of the new precipitation data for Amazon/south America based on our gained experience in Peru
- Analysis of water budget of Amazon River Basin and its sensitivity to climate change



**Motivation:** Poor performance of hydrological model using different precipitation (P) datasets in the upper Amazon River Basin



Nash–Sutcliffe efficiency (NSE)



### Data: observed precipitation (P) data for 1981-2015



INTERNATIONAL JOURNAL OF CLIMATOLOGY Int. J. Climatol. 36: 2644–2659 (2016) Published online 8 October 2015 in Wiley Online Library (wileyonlinelibrary.com) DOI: 10.1002/joc.4518



#### Daily gridded meteorological variables in Brazil (1980-2013)

Alexandre C. Xavier,<sup>a</sup> Carey W. King<sup>b\*</sup> and Bridget R. Scanlon<sup>c</sup> <sup>a</sup> Department of Rural Engineering, Federal University of Espírito Santo, Vitória, Brazil <sup>b</sup> Energy Institute, The University of Texas at Austin, TX, USA <sup>c</sup> Bureau of Economic Geology, The Jackson School of Geosciences, The University of Texas at Austin, TX, USA







## Is the generation of gridded precipitation data for Amazon/South America of your interest?

How can we obtain the observed precipitation and discharge data?

How can we collaborate with your institution?



# THANKS