



# Web-based CHIRPS bias correction tool to improve hydrological simulation in SWAT

Julio Pérez-Sánchez, Javier Senent-Aparicio, Patricia Jimeno-Sáez, Adrián López-Ballesteros, José Ginés Giménez, José M. Cecilia

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Chirp_1	43.025 : -7.975	[2000-01-01', '2020-12-	31]ALL	IDW						
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•								•		



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# Outline

- □ Introduction: Scientifical Context and Objectives.
- Methodology
  - CHIRPS data-set
  - Rain gauge stations
  - Bias-correction techniques
- Study Case
  - Results
  - Discussion
- Conclusions.





## **Scientifical Context**

#### Introduction

- Scientifical context
- Objectives

Methodology

Study case

- Rainfall data are crucial in the application of hydrological models such as the Soil and Water Assessment Tool (SWAT).
- Conventional ground-based gauge stations are the sources of rainfall measurement data.
- Their spatial and temporal distribution will determine the reliability in replicating the different processes in water cycle.
  - Historical records are unsuitable
  - Contain missing values (technical failures)
  - Inadequate spatial coverage.





# **Scientifical Context**

#### Introduction

Scientifical context

**Objectives** 

Methodology

Study case

- In the last decades, open-access satellite precipitation products have become a potential tool to overcome these constraints.
- Examples: Tropical Rainfall Measuring Mission (TRMM)
   Multisatellite Precipitation Analysis (TMPA), Climate Prediction
   Center (CPC) morphing technique (CMORPH), Precipitation from
   Remotely Sensed Information using Artificial Neural Networks
   (PERSIANN) or Climate Hazards Group (CHG) InfraRed Precipitation
   (CHIRP) and combined with stations observations (CHIRPS).
- CHIRPS has proved to be a good alternative input for the SWAT model to predict the streamflow in diverse climatic conditions (Dhanesh et al., 2020)





### **Scientifical Context**

 Satellite rainfall estimation algorithms are extensively being explored to produce reliable and accurate estimates meaningful for hydrological assessments.

Methodology

Introduction

Scientifical context

**Objectives** 

Study case

- Evaluation studies show that estimates are subjected to systematic and random errors (Fuka et al. 2014; Bhatti et al. 2016)
  - The systematic error (bias) should be removed before the products can be used for hydrological and water resources applications.





### Objectives

#### Introduction

- Scientifical context
- Objectives

Methodology

Study case

- Provide a web-based tool to easily download CHIRPS grid data in a region in SWAT format (both raw and corrected).
- Choice and assessment of different bias-correction techniques using existing rainfall gauge station datasets.
- Performance the hydrological models in SWAT with different grids in order to analyse the results.
  - Comparison of the statistics computed using the bias-correction
     grid data over raw dataset in a streamflow simulation.





Introduction

### Methodology Step 1

Step 2 Step 3 Step 4

Study case

Conclusions

**CHIRPS** (Climate Hazards Group InfraRed Precipitation with Station data)

- **35+ year** quasi-global (50°N-50°S) rainfall dataset of **0.05**°
   **spatial resolution** (time series of gridded rainfall).
- It incorporates Climate Hazards Group Rainfall Climatology (CHP Clim), geostationary thermal infrared satellite observations, Tropical Rainfall Measuring Mission (TRMM), atmospheric model rainfall fields from NOAA Climate Forecast System and rainfall observations from national or regional meteorological sources.
- The dataset is available **open-source**.
- Period 1981-near present.
- http://chg.geog.ucsb.edu/data/chirps/





Web-based CHIRPS bias correction tool for improved hydrological simulation in SWAT



## http://facu.ucam.edu:8080/

Introduction	CHIRP Tool bias correction					
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	chardet==5.1.0					



Web-based CHIRPS bias correction tool for improved hydrological simulation in SWAT



# http://facu.ucam.edu:8080/

```
Introduction
                           def calculate_b_factor(self, serie):
                               months = pd.DataFrame(
                                   {'count': self.observed_adjusted[self.parameter].groupby(self.observed_adjusted.index.month).count(),
                                    'count_raw': serie[self.parameter].groupby(serie.index.month).count()})
                               for actual in range(1, 13):
Methodology
                                   pre = (actual - 1) % 12
                                   post = (actual + 1) % 12
   Step 1
                                   pre = 12 if (pre == 0) else pre
   Step 2
                                   post = 12 if (post == 0) else post
                                   months.at[actual, "mean raw"] = \lambda
   Step 3
                                   serie[(serie['month'] == actual) | (serie['month'] == pre) | (serie['month'] == post)][
                                       self.parameter].mean()
    Step 4
                                   months.at[actual, "std_raw"] = \
                                   serie[(serie['month'] == actual) | (serie['month'] == pre) | (serie['month'] == post)][self.parameter].std()
                                   months.at[actual, "mean_obs"] = self.observed_adjusted[
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Study case
                                                   self.observed_adjusted.index.month == post)][self.parameter].mean()
                                   months.at[actual, "std_obs"] = self.observed_adjusted[
                                       (self.observed_adjusted.index.month == actual) | (self.observed_adjusted.index.month == pre) | (
                                                   self.observed_adjusted.index.month == post)][self.parameter].std()
                               months['CV_obs'] = months['std_obs'] / months['mean_obs']
Conclusions
                               months['CV_raw'] = months['std_raw'] / months['mean_raw']
                               def b_function_1(b, serie, cv_obs):
                                   return (cv_obs - (np.std(np.power(serie, b)) / np.mean(np.power(serie, b), dtype=np.floató4)))
```



Web-based CHIRPS bias correction tool for improved hydrological simulation in SWAT



### **Step 1: Load CHIRPS region**

Introduction	CHIRP Tool bias correction	_					UCAM UNIVERSIDED
	Load CHIRP region	Chirp point loaded		User stations up			
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Web-based CHIRPS bias correction tool for improved hydrological simulation in SWAT



### **Step 1: Load CHIRPS region**



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	Load CHIRP region	Chirp point loaded		User stations uplo	paded		
	Set region coordinates:		Name Lat	Lon	Years	_	
Methodology							
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	-	Chirp_170_PCP				43.025, -7.775, 43.025, -7.725,	
	latitude: [43.0, 43.4]	Chirp_169_PCP		7,0	Chirp_7_PCP,	43.025,-7.675, 43.025,-7.625,	0
<b>~</b> · ·	longitude: [-8.0, -7.5]			9,0	Chirp_9_PCP,	43.025,-7.575,	0
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		Chirp_166_PCP		14,	,Chirp_14_PC	P,43.025,-7.32	5, 0
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		Chirp_164_PCP				P.43.0757.97	



Web-based CHIRPS bias correction tool for improved hydrological simulation in SWAT



### **Step 2: Upload rain gauge station data**

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Conclusions		C	Elegir archivo No si ha sele ningún archi	Upload files					



Web-based CHIRPS bias correction tool for improved hydrological simulation in SWAT



# Step 2: Upload rain gauge station data

Introduction

### File compressed in ZIP

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Step 1
Step 2
Step 3
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Study case

Conclusions

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Upload files

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Web-based CHIRPS bias correction tool for improved hydrological simulation in SWAT



# Step 2: Upload rain gauge station data

#### Introduction

#### Methodology

Step 1
Step 2
Step 3
Step 4

Study case

Name	Lat	Lon	Years
PCP_CornoDoBoi	43.037	-7.893	['2005-06-09', '2020-10-26']
PCP_Sambreixo	43.146	-7.791	['2005-06-09', '2020-10-26']
PCP_Cospeito	43.24	-7.555	['2019-10-04', '2020-10-26']
PCP_GuiturizMirador	43.227	-7.783	['2001-01-02', '2020-10-26']
PCP_MarcoDaCurra	43.343	-7.894	['2000-02-04', '2020-10-26']
PCP_Lanzos	43.375	-7.645	['2012-03-08', '2020-10-26']

User stations uploaded

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### **Step 3: Bias correction**

Introduction

Methodology

Step 1

Step 2

Step 3

Step 4

Study case

Chirp point loaded
Total points loaded: 99
Years: ['2010', '2020']
Region:

Linear scaling (LS):

$$P_{cor,m,d} = P_{raw,m,d} \cdot \frac{\mu(P_{obs,m})}{\mu(P_{raw,m})}$$

Local intensity scaling (LOCI):

 $P_{cor,m,d} = \begin{cases} 0 & \text{if } P_{raw,m,d} < P_{thres,m} \\ P_{raw,m,d} \cdot S_m & \text{otherwise} \end{cases}$ 

$$S_m = \frac{\mu(P_{obs,m,d} | P_{obs,m,d} > 0)}{\mu(P_{raw,m,d} | P_{raw,m,d} > P_{thres,m})}$$

### Power transformation (PT):

$$P_{cor,m,d} = s_m \cdot P_{LOCI,m,d}^{b_m}$$

$$s_m = \frac{\mu(P_{obs,m})}{\mu(P_{LOCI,m}^{b_m})}$$

$$f(b_m) = \frac{\sigma(P_{obs,m})}{\mu(P_{LOCI,m}^{b_m})} - \frac{\sigma(P_{LOCI,m}^{b_m})}{\mu(P_{LOCI,m}^{b_m})}$$

latitude: [43.0, 43.4]

longitude: [-8.0, -7.5]

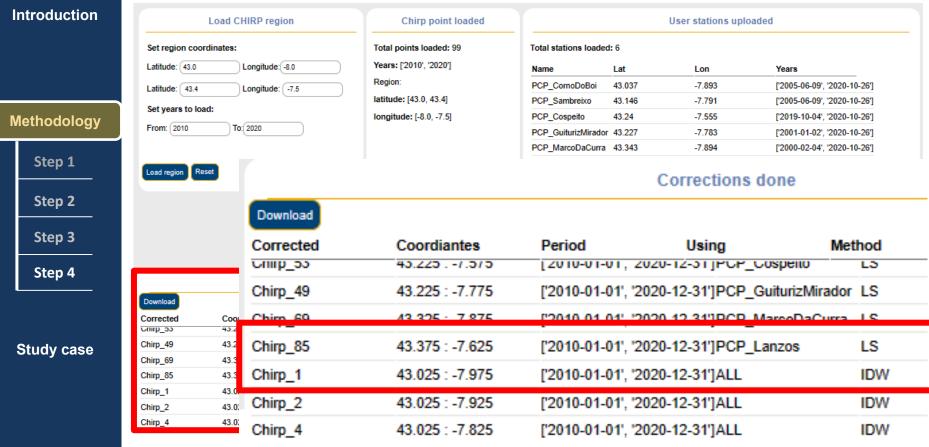
Correct	
Method [	
Thresho	Linear Scaling Power Transformation



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### **Step 4: Download corrected data**



- Bias-correction of nearest grid center to uploaded stations.
- Rest grid cells affected by interpolated coefficients using the inverse distance weighting method (IDW).



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Corrections done



### Step 4: Download corrected data

Introduction

Methodology

Step 1

Step 2

Step 3

Step 4

Study case

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Chirp_172_PCP		2,Chirp_2		0.0
		3,Chirp_3 4,Chirp 4		14.21709537506103
Chirp_171_PCP		5, Chirp 5		0.0
Chirp_170_PCP		6,Chirp_6		0.0
		7,Chirp_7		0.0
Chirp_169_PCP		8, Chirp_8		0.0 0.0
Chirp_168_PCP		9,Chirp_9		0.0
Chilp_106_PCP		10,Chirp_ 11,Chirp		0.0
Chirp_167_PCP		12, Chirp		0.0
		13, Chirp		0.0
Chirp_166_PCP		14, Chirp_		0.0
Chirp_165_PCP		15,Chirp_		0.0
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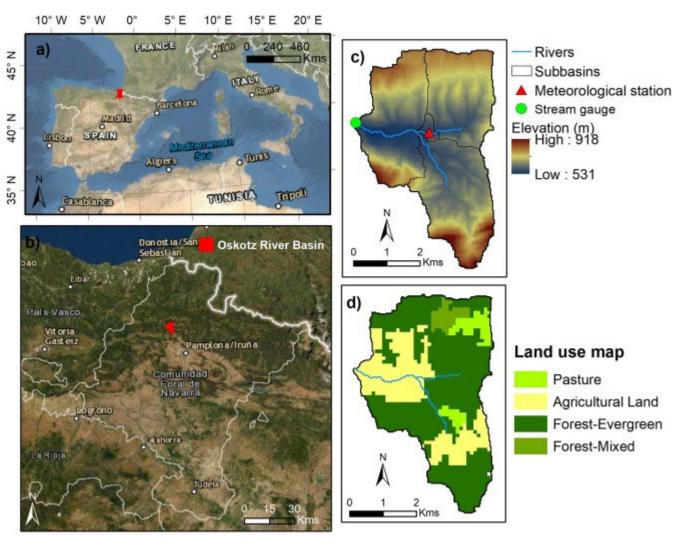


### Study case

Introduction

Methodology

Study case





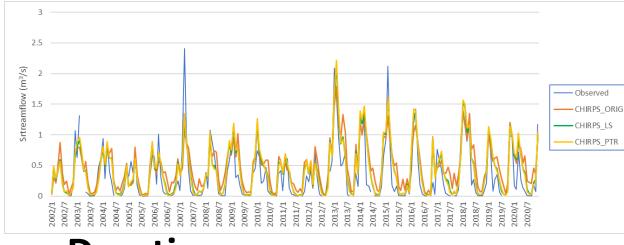
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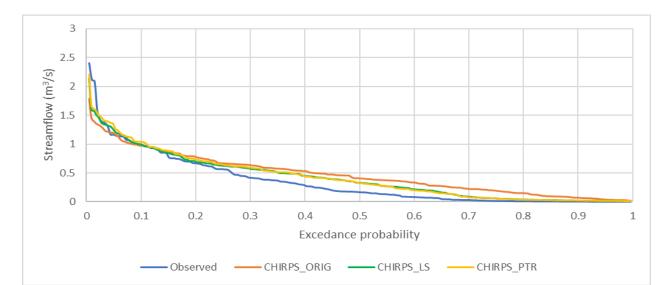
### Hydrograph

Introduction

#### Methodology



### **Flow-Duration curve**



Study case



Web-based CHIRPS bias correction tool for improved hydrological simulation in SWAT



#### **Statistics** Introduction CHIRPS ORIG CHIRPS LS CHIRPS PT CHIRPS LOCI R<sup>2</sup> 0.65 0.76 0.77 0.46 NSE 0.54 0.70 0.70 0.52 -30.00% Methodology **PBIAS** -44.82% -31.09% 46.72%

- General underestimation for the highest flow peaks.
- Overestimation for medium/base streamflow for raw-CHIRPS
- Better performance for low flow with LS/PT.
- Significant improvement with LS and PT vs. raw-CHIRPS.
- Similar results with LS and PT.
- Increase R<sup>2</sup> and Nash-Sutcliffe efficiency by 17% and 30%.
- Decrease PBIAS around 15%.
- Poor performance with LOCI.

Study case

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Introduction

Methodology

- Application of the **bias-correction methods significantly improves** the flow simulation.
- CHIRPS Tool bias correction software enables filling of missing precipitation records.
  - CHIRPS Tool provides a **dense grid data** of 0.05<sup>o</sup> resolution enhancing watershed spatial analysis.
  - The CHIRPS tool is quasi-global extension available (50°N-50°S 180°W-180°E) hosted in <u>http://facu.ucam.edu:8080</u>
- Study case
- CHIRPS Tool provides a useful and easy-to-use tool that will help research community and water managers to improve the feasibility of hydrological modelling.





# Thank you for your attention!

