

### **GIoFAS-ERA5 operational global river discharge reanalysis** 1979-present

Shaun Harrigan, Ervin Zsoter, Lorenzo Alfieri, Christel Prudhomme, Peter Salamon, Fredrik Wetterhall, Christopher Barnard, Hannah Cloke & Florian Pappenberger

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# **New dataset for large scale hydrology**

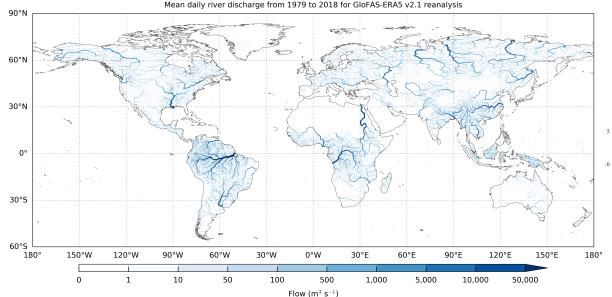


European Commission

Earth System

Science

Data



GloFAS-ERA5 operational global river discharge reanalysis 1979present

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Click <u>here</u> for full details, evaluation and how to download data in Harrigan et al. (2020) data paper in ESSDD

- Estimating river discharge for every river in the world in real time is a challenge due to lack of in situ observations
- Optimally combining Earth observations with Numerical Weather Prediction (NWP) modelling and hydrological modelling to provide a 'reanalysis' is a way forward
- GloFAS-ERA5 river discharge reanalysis dataset freely available from 1979 to near real time

# Summary of GIoFAS-ERA5 v2.1 attributes

### Data available on Copernicus Climate Data Store (CDS) here $\sqrt{n}$



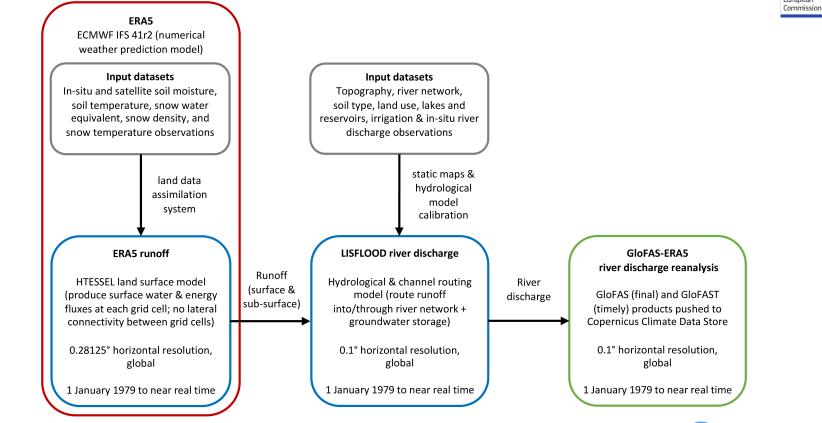
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	—			
Dataset attributes	Details			
Horizontal coverage	Global except for Antarctica (90° N-60° S, 180° W-180° E)			
Horizontal resolution	0.1° x 0.1° gridded			
Spatial reference system	Latitude/Longitude (WGS 84, EPSG:4326)			
Vertical resolution	Surface level for river discharge			
Temporal resolution	Daily data			
Temporal coverage	1979-01-01 to near real time			
Availability behind real time	i.) GloFAS (consolidated final product): 2 to 3 months, updated on CDS monthly			
	ii.) GloFAST (intermediate timely product): 2 to 5 days, updated on CDS daily			
File format	NetCDF			
Data size on disk	a size on disk Approximately 21.7 MB uncompressed per global NetCDF file for one day			
	(full dataset currently ~320 GB uncompressed)			



# **Dataset production**





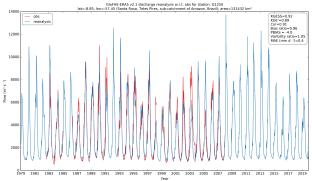
EUROPEAN CENTRE FOR MEDIUM-RANGE WEATHER FORECASTS

# Evaluation against river discharge observations

#### Global river discharge observations:

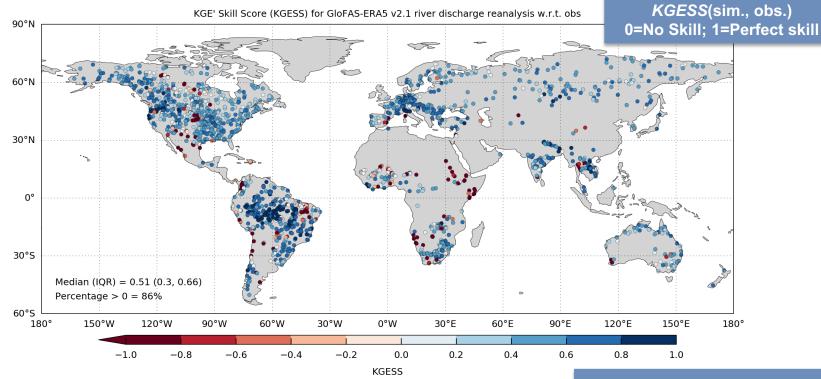
- 1801 stations with at least 4 years of data over 1979-2018
- Catchment drainage area from 575 km<sup>2</sup> to 4,664,200 km<sup>2</sup>
- Evaluation of hydrological skill:
  - Modified Kling-Gupta Efficiency (KGE'; Gupta et al., 2009; Kling et al., 2012)
    - Decomposed into Pearson correlation (r), bias ratio ( $\beta$ ) and variability ratio ( $\gamma$ )
  - We expressed as KGE' Skill Score (KGESS) to calculate hydrological *skill* against a benchmark:
    - KGE'<sub>reanalysis</sub>: KGE' for reanalysis v observations
    - KGE' bench: KGE' for mean flow benchmark v observations (proposed by Knoben et al., 2019)
    - KGE'<sub>perf</sub>: Perfect value of the KGE', which is 1





# **Overall performance**





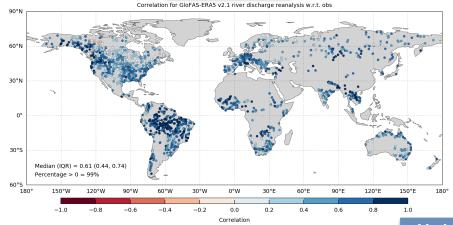
GloFAS-ERA5 river discharge reanalysis shows hydrological skill in 86 % of catchments

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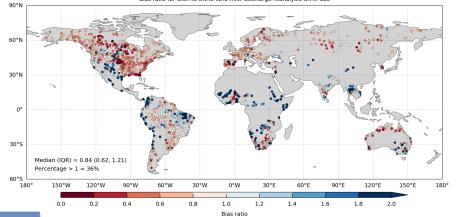
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# **KGE' Decomposition**

#### Correlation *r*



Bias β



Variability  $\gamma$ 

Global median bias (expressed as PBIAS) of -16 % (IQR = -38 %, 21 %)

12 % of catchments have positive PBIAS > 100 % (i.e. bias ratio > 2)

Variability errors less severe than bias with median -9 % (IQR = -31 %, 15 %)

Almost all (99%) catchments show positive correlation

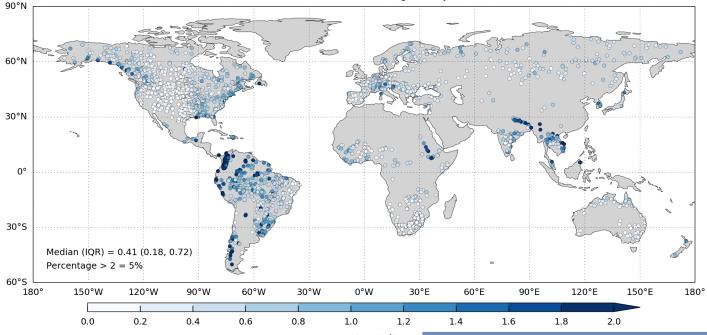
Global median Pearson correlation coefficient of 0.61 (IQR = 0.44, 0.74)

## Average magnitude of errors in mm d<sup>-1</sup>





MAE for GloFAS-ERA5 v2.1 river discharge reanalysis w.r.t. obs



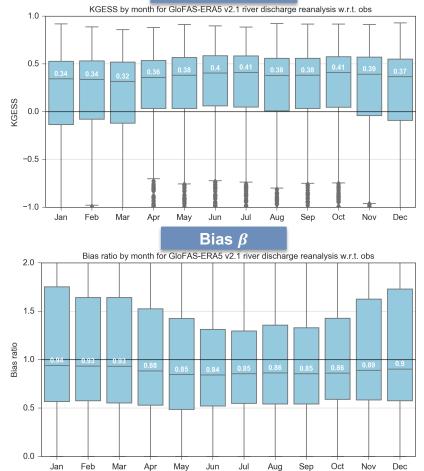
MAE (mm d $^{-1}$ )

Over/under estimation in dry rivers can produce large percentage biases (e.g. Africa, central US, eastern Brazil and Australia), so it is important to also look at average magnitude of errors, here using Mean Absolute Error (MAE) of flows standardised by upstream area into mm d<sup>-1</sup>

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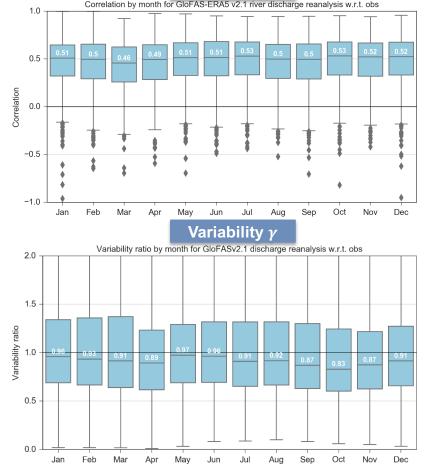
### Performance by month

KGE Skill Score



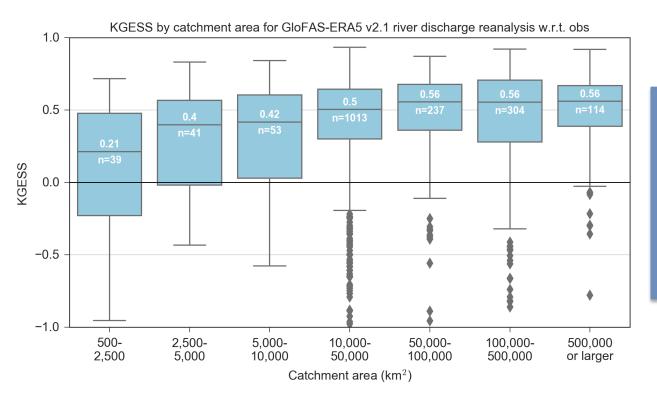
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#### Correlation r



Correlation by month for GloFAS-ERA5 v2.1 river discharge reanalysis w.r.t. obs

# Performance by catchment size



Skill lowest for catchments in the three categories <  $10,000 \text{ km}^2$  with median KGESS = 0.21 (n=39), 0.4 (n=41), and 0.42 (n=53)

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Performance improves as catchment size increases, with median KGESS = 0.56 for catchments > 50,000 km<sup>2</sup>







- GloFAS-ERA5 shows hydrological skill in 86 % of catchments:
  - Although, water balance errors have been identified in the reanalysis, e.g. western coast of S. America, Sudan and Ethiopia and tributaries of the Ganges - Future versions will aim to improve on these issues. Users are advised to undertake more in-depth evaluation for their region of interest
- Long-term and operational nature of GloFAS-ERA5 provides a valuable dataset to the community for large scale hydrology applications, e.g.:
  - Monitoring global flood and drought conditions
  - Understanding hydroclimatic variability and change
  - Initialising hydrological forecasts & forecast evaluation
  - As raw input to post-processing and machine learning methods

**Questions?** 

Thanks! shaun.harrigan@ecmwf.int Full details and evaluation <mark>here</mark> in data paper (Harrigan et al., 2020) submitted to ESSDD

Download dataset <u>here</u> from Copernicus Climate Data Store (CDS) DOI: 10.24381/cds.a4fdd6b9



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## Download: Copernicus Climate Data Store (CDS)



**CDS** website form

**CDS Python API request** 

# https://cds.climate.copernicus.eu/cdsapp#!/dataset/cems-glofas-historical?tab=form

# Example download consolidated data (GloFAS) for 31 December 2018 (note: date stamp

# Example download near real time intermediate data (GloFAST) for 12 November 2019 (note:

# Code snippets can be found by clicking 'Show API request' at # bottom of GloFAS-ERA5 reanalysis download form:

# Instructions on how to download CDS API can be found here: # https://cds.climate.copernicus.eu/api-how-to

represents end of 24 h averaging period)

'variable':'Biver discharge'. 'dataset':'Consolidated reanalysis', 'version':'2.1', 'year':'2019', 'month':'01', 'day':'01', 'format':'tgg' 'download.tar.gz')

date stamp represent end of 24 h averaging period)

'dataset':'Intermediate dataset' 'version':'2.1', 'year':'2019', 'month':'11', 'day':'13'.

'fornat':'tqz' 'download.tar.gz'

Overview Download data Documentation Variable 😕 II five docharge Dataset 😗 E Conspidend Version @ Year

> import cdsapi c = cdsapi.Client()

.retrieve( 'cems-glofas-historical',

.<u>retrieve(</u> 'cems-glofas-historical', 'variable':'River discharge',

River discharge and related historical data from the Global Flood Awareness System

<u>erre</u>	C. been			Shaun Harrigan Logo Your feedback helps us to improve the se
iver discharg			cal data from the Global Flood Awareness System	
Overview Downlo	oad data	Documentation		Contact
This distast contains global modelled daily data of <b>fiver discharge</b> from the Global Plood Awareness System (GIGRA), which is part of the Copernics Emergency Management. Service (CISA), New discharge, or mellow as its also iteration, is defined as the amount of water that the structure of a mere that the structure of the stru				copernicus-support@ecmwf.int
rom 1979-0101 is go near real time. He indiar suffere model target product are given in the Documentation section.				CEMS-FLOODS datasets licence Publication date
DATA DESCRIPTION				2019-11-05 References
Horizontal coverage	Global exce	not for Antarctica (90N	-605.180W-180E	
Horizontal resolution	0.1° × 0.1°			DOI: 10.24381/cds.a4fdd6b9
Vertical resolution	Surface lev	el for river discharge		
Temporal coverage	1979-01-01	to near real time for	the most recent version.	Related data
Temporal resolution	Daily data			
Update frequency	A new river we refer to	discharge reanalysis the documentation.	will be published with every major update of the GLOFAS system. The latest version will always be the version used in operations. For more information on the model versions,	River discharge and related forecasted data by the European Floor Awareness System
File format	NetCDF			River discharge and related historical data from the European Floo
Data type	GRID			Awareness System
Versions	GIOFAS v2.	1		
MAIN VARIABLES				
Name Un	its Descript	ion		
River discharge m <sup>3</sup>	s <sup>-1</sup> Volume	rate of water flow, inc	uding sediments, chemical and biological material, in the river channel averaged over a time step through a cross-section. The value is an average over a 24-hour period.	
RELATED VARIABLES				
Name		Units Description		
Upstream area		m <sup>2</sup>	Static file - upArea.nc, Upstream area for the point in the river network	

Record updated 2019-11-05 13:49:03 UTC

 Download direct from <u>CDS website form</u> (<sup>In</sup>) Programmatic access via <u>CDS Python API</u> (<sup>In</sup>)



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