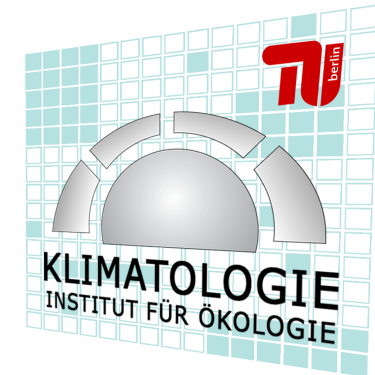


High Asia Refined analysis (HAR) for Identifying Climatic Triggers of Landslides in Central Asia



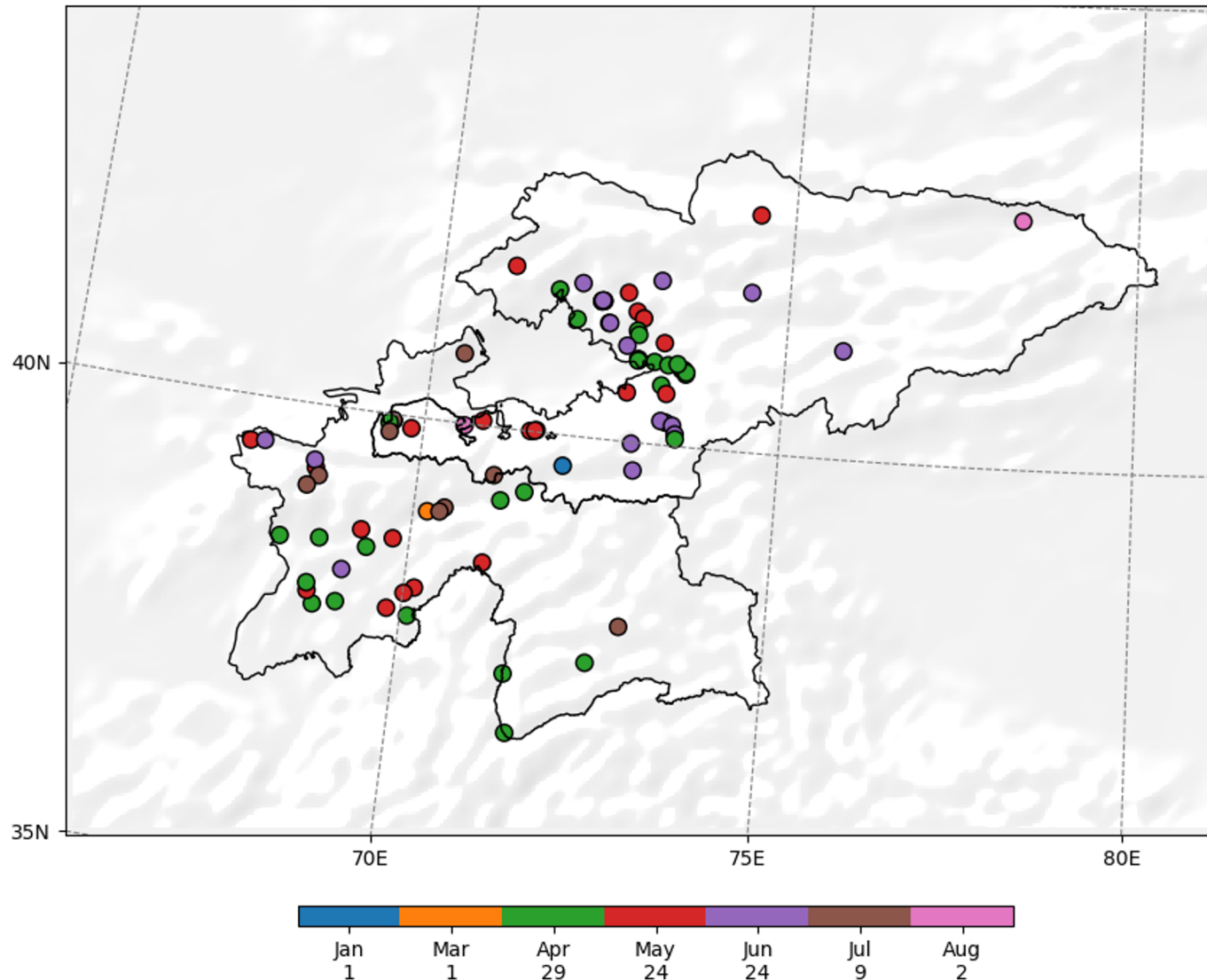
Xun Wang, Marco Otto, Dieter Scherer
Chair of Climatology, Institute of Ecology
Technische Universität Berlin



CLIENT II

International Partnerships
for Sustainable Innovations

Landslide Hazards in Central Asia



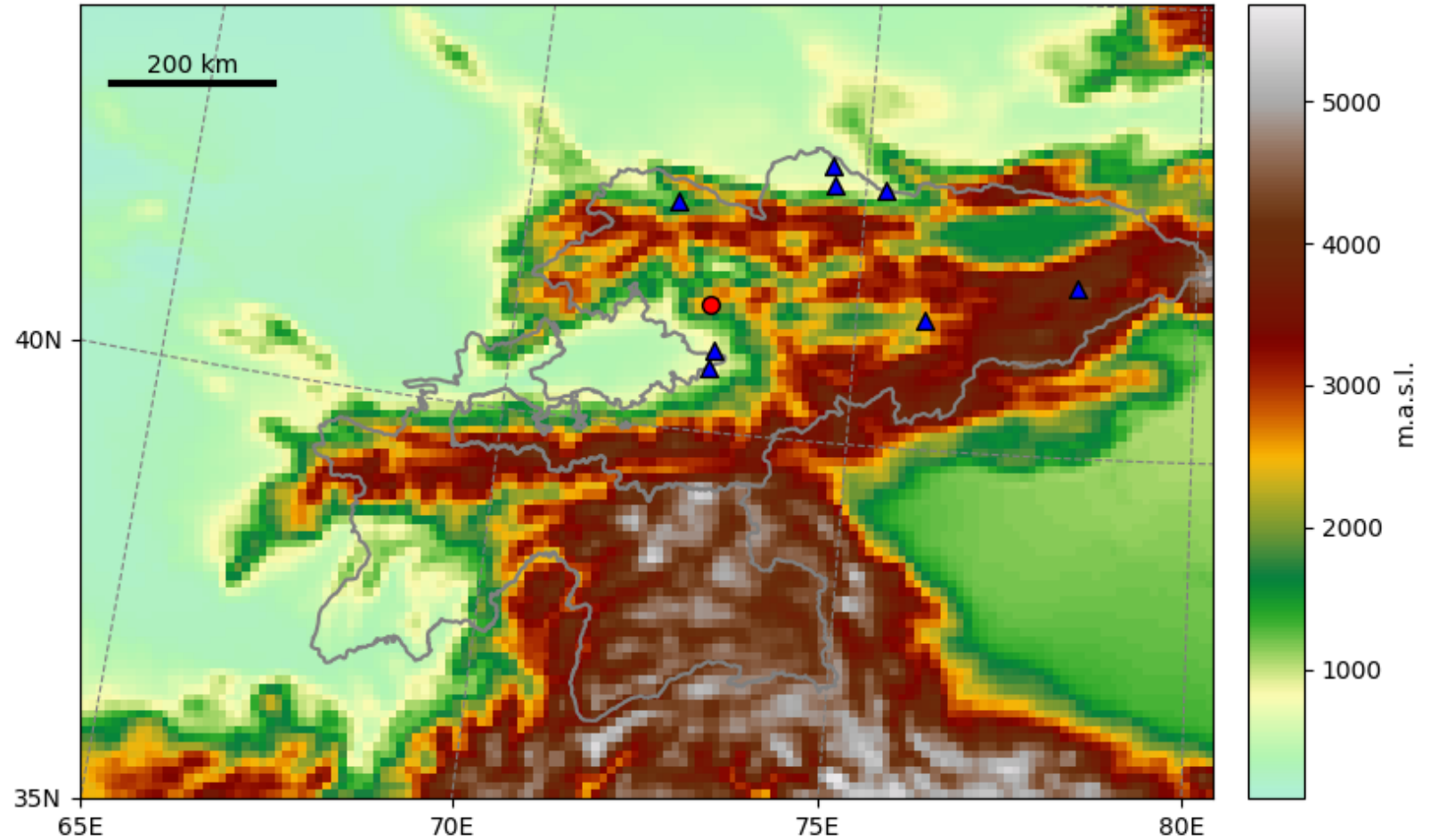
Rainfall triggered landslides in Kyrgyzstan and Tajikistan in 2007-2017.

Source: Global Landslide Catalog, NASA; Global fatal landslide database, Sheffield University

Available Weather Stations

● Landslide event on 2011-05-11

▲ Weather stations from GSOD

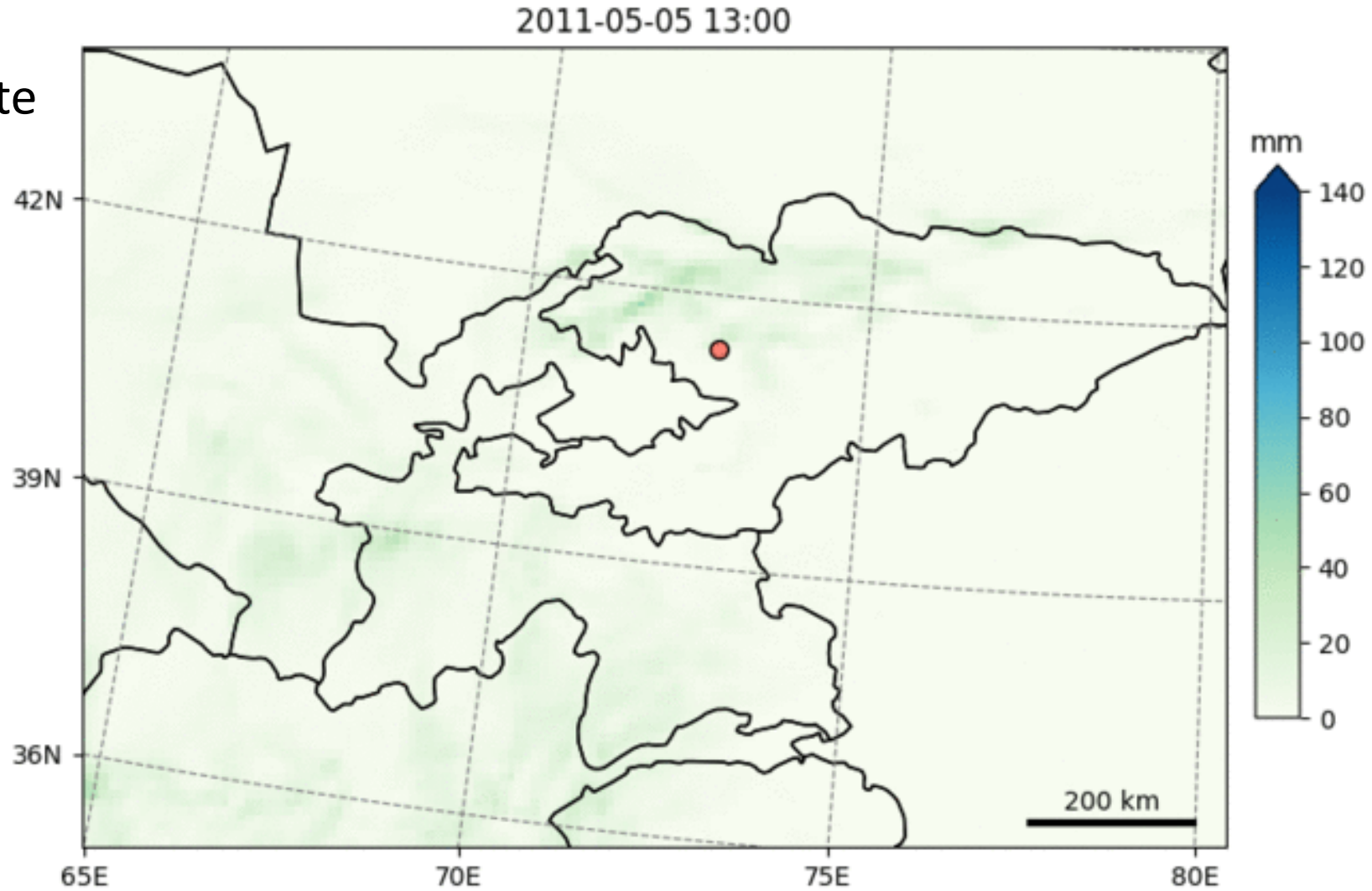
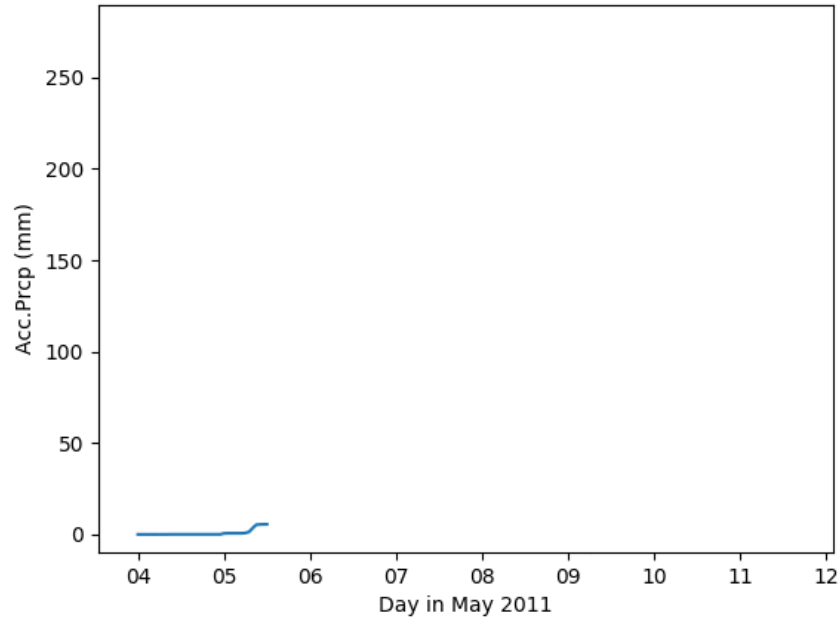


Source: Global Landslide Catalog, NASA;
Global Surface Summary of the Day, NOAA

A Feasibility Study

Accumulated precipitation

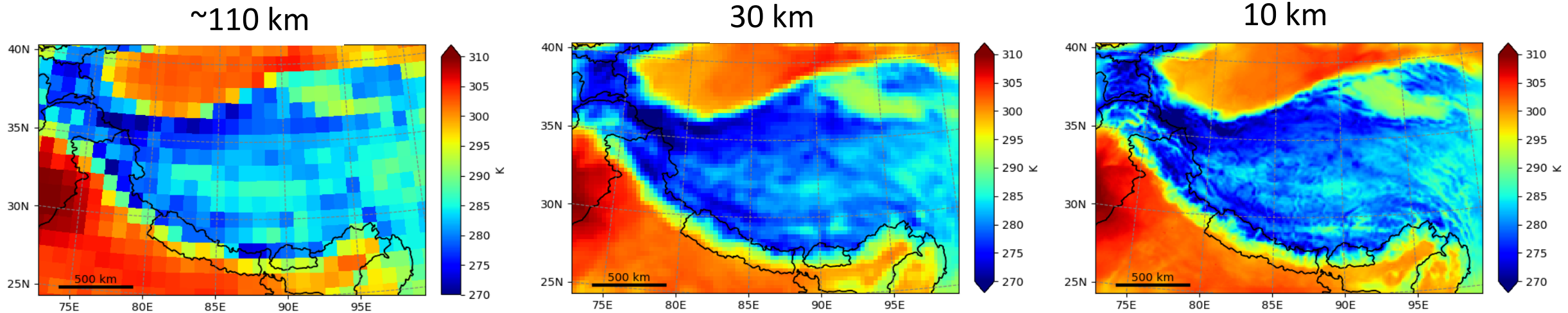
(generated by a regional climate model in 10 km resolution)



Dynamical Downscaling

What? -> a method in **regional climate modelling** to obtain climate data with **high spatial and temporal resolution**

How? -> using global data as initial and boundary conditions to drive a Regional Climate Model (RCM)



Pros -> based on physical principles

Cons -> computation-intensive and time-consuming

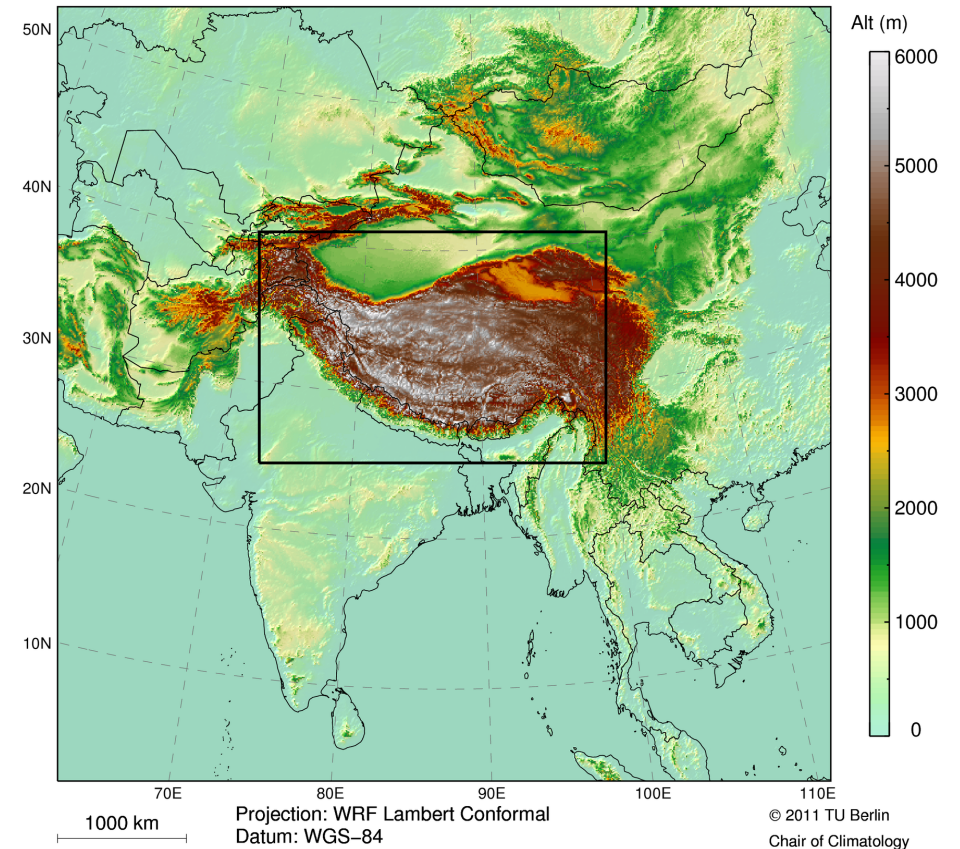
High Asia Refined Analysis (HAR)

- An atmospheric dataset generated by dynamical downscaling
- Spatial resolution: 30 km, 10 km
- Temporal coverage: October 2000 – October 2014
- Comprehensively analyzed and validated (e.g. Prichard et al., 2019; Li et al., 2020)
- Widely applied in many research fields, such as snow and energy balance modelling, hydrological modelling, etc.

But:

-> 10 km domain does not cover the whole Kyrgyzstan and Tajikistan

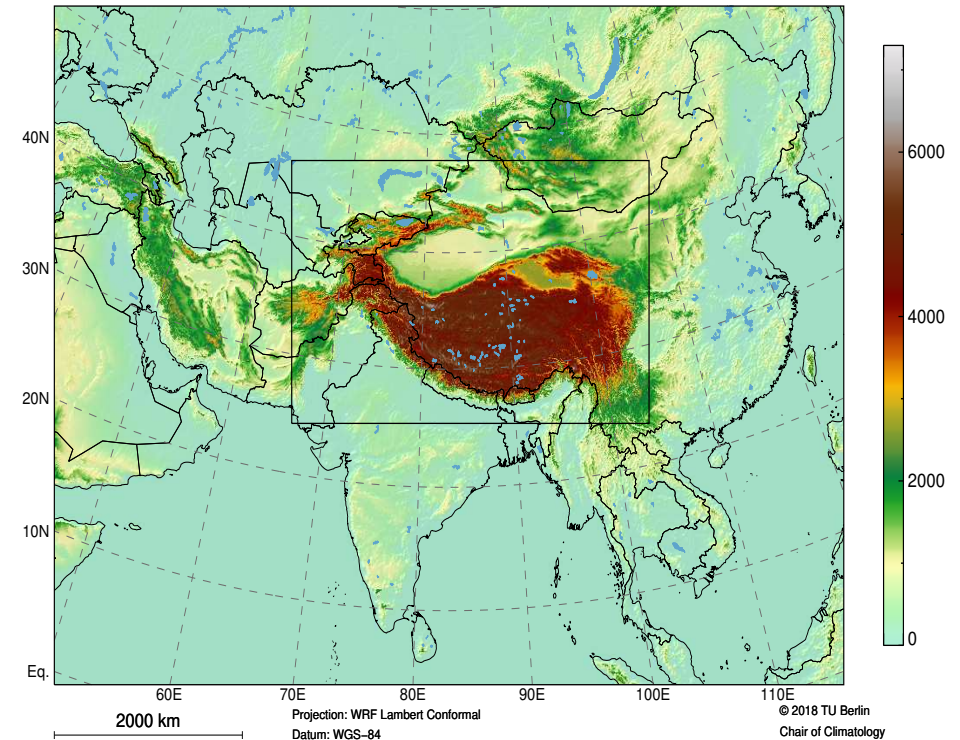
-> temporal coverage is too short for long-term and climatological studies



Maussion et al. (2011, 2014)

High Asia Refined Analysis Version 2 (HAR v2)

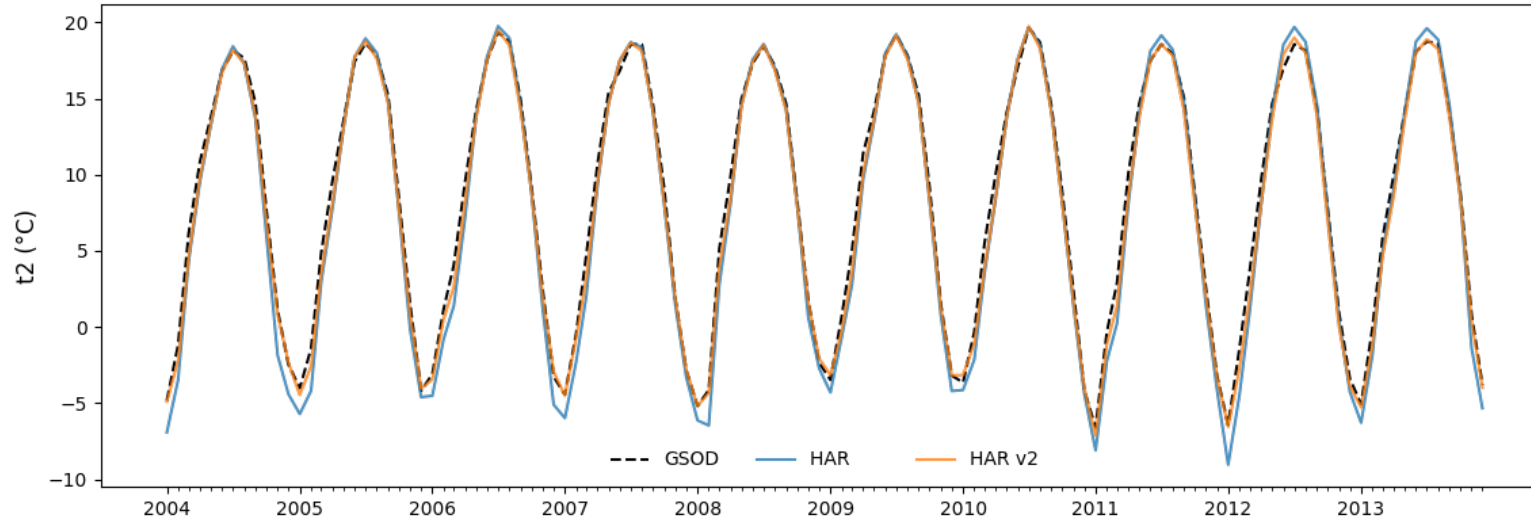
- Strategy: dynamical downscaling
- Forcing Data: ERA5 reanalysis
- RCM: Weather Research & Forecasting model (WRF) V4.1
- Spatial resolution : 10 km
- Currently, simulation for years 2004 -2018 is available



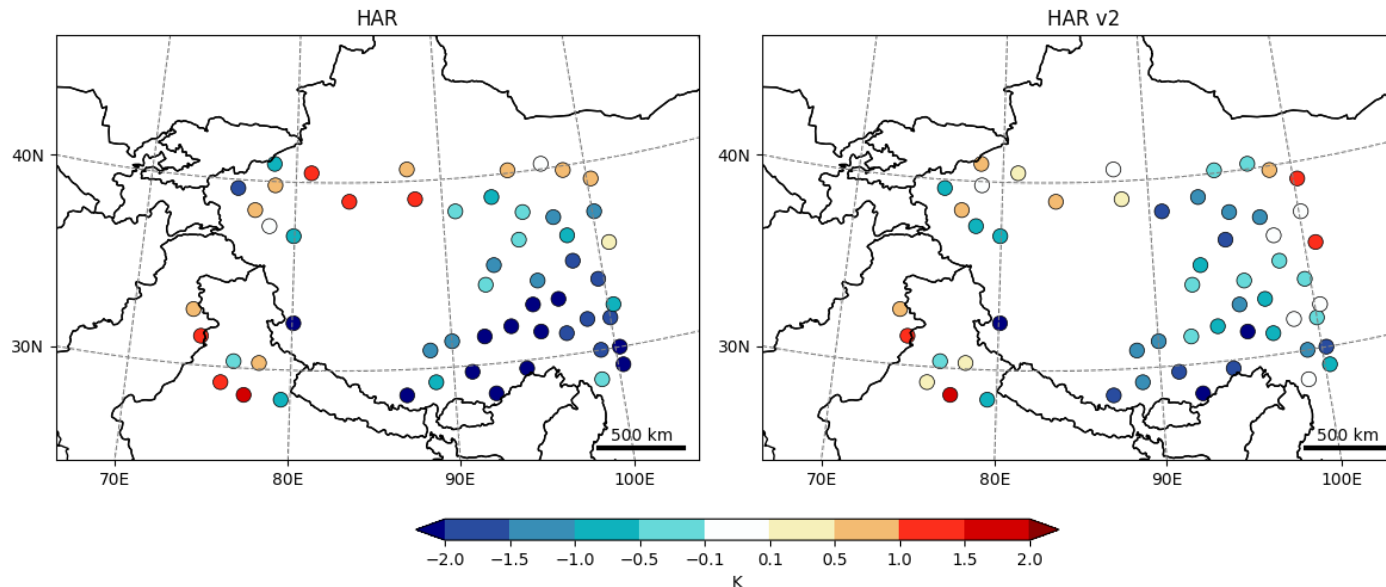
Wang, X., Tolksdorf, V., Otto, M., & Scherer, D. (2020) WRF-based Dynamical Downscaling of ERA5 Reanalysis Data for High Mountain Asia: Towards a New Version of the High Asia Refined Analysis. *International Journal of Climatology*.

Validation

Air temperature at 2 m

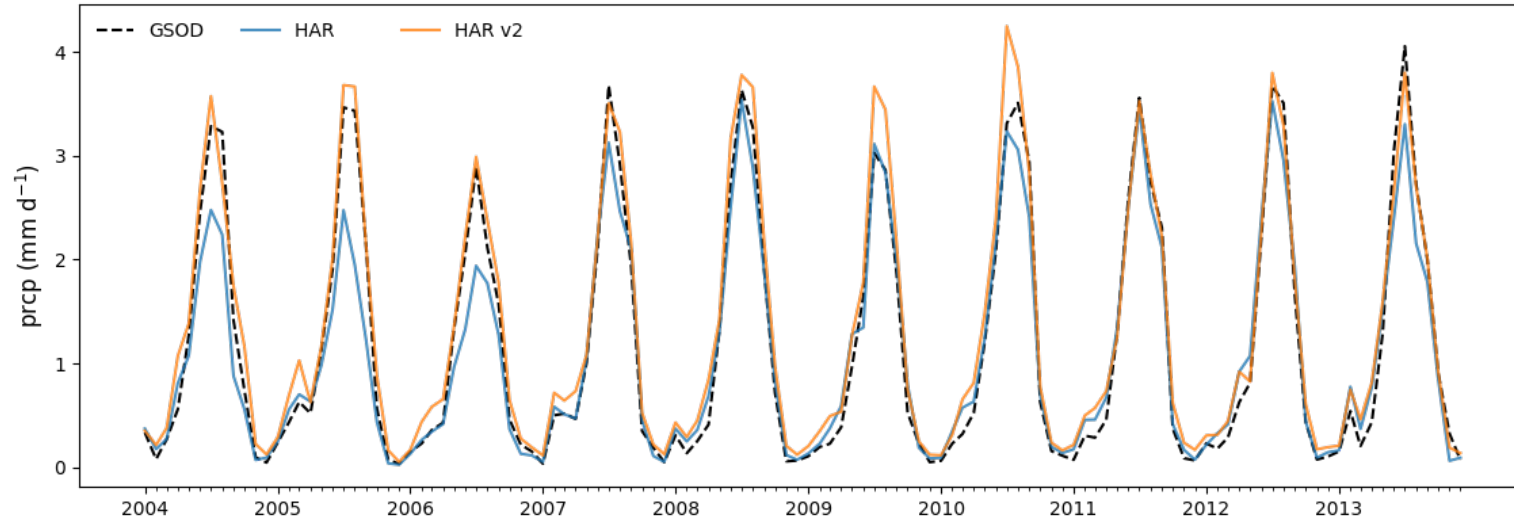


Monthly time series of air temperature at 2 m (°C) from GSOD, HAR and HAR v2.

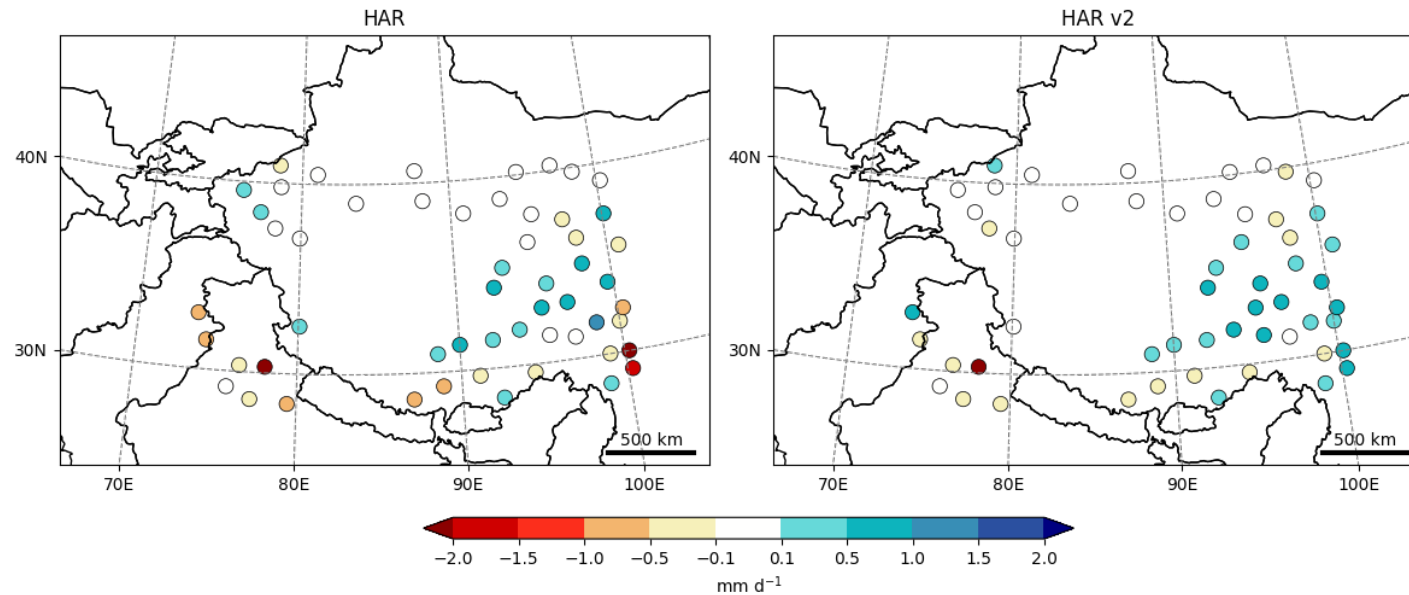


Mean bias (K) of monthly air temperature at 2 m from 2004-2013 for HAR (left) and HAR v2 (right) at GSOD stations.

Validation Precipitation



Monthly time series of precipitation (mm d⁻¹) from GSOD, HAR and HAR v2.



Mean bias (mm d⁻¹) of monthly precipitation from 2004-2013 for HAR (left) and HAR v2 (right) at GSOD stations.

How to Download?


- HAR v2 website:

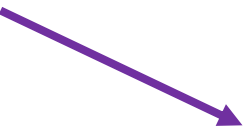
www.klima.tu-berlin.de/HARv2

- The output of the model is post-processed into *product-files*: one single file per variable and per year at various temporal resolutions
- File naming convention:

HAR v2_**spatial resolution**_**temporal resolution**_**variable type**_**variable name**_**year**.nc

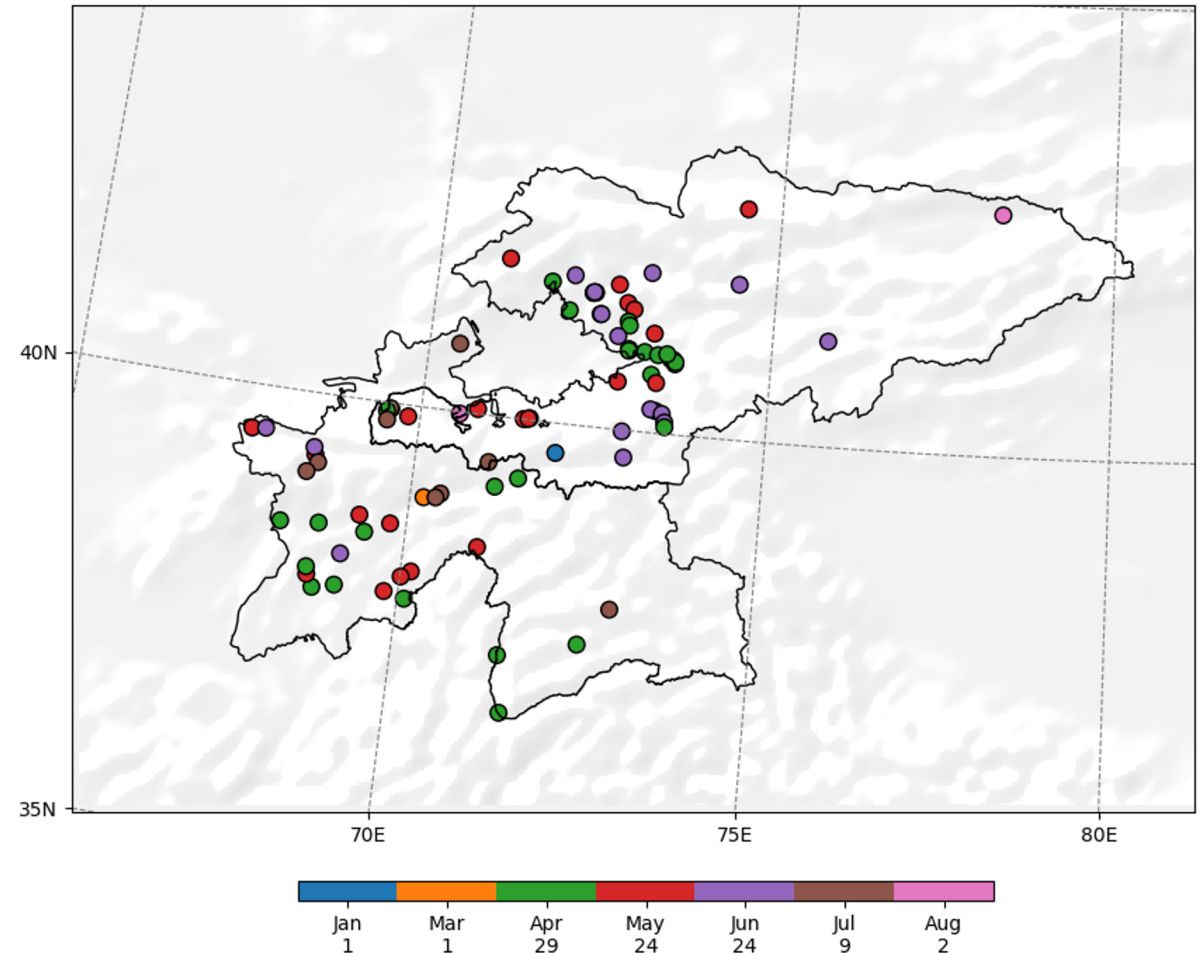

d10km


h (hourly, model output)
d (daily means)
m (monthly means)
y (yearly means)
static (time invariable fields)

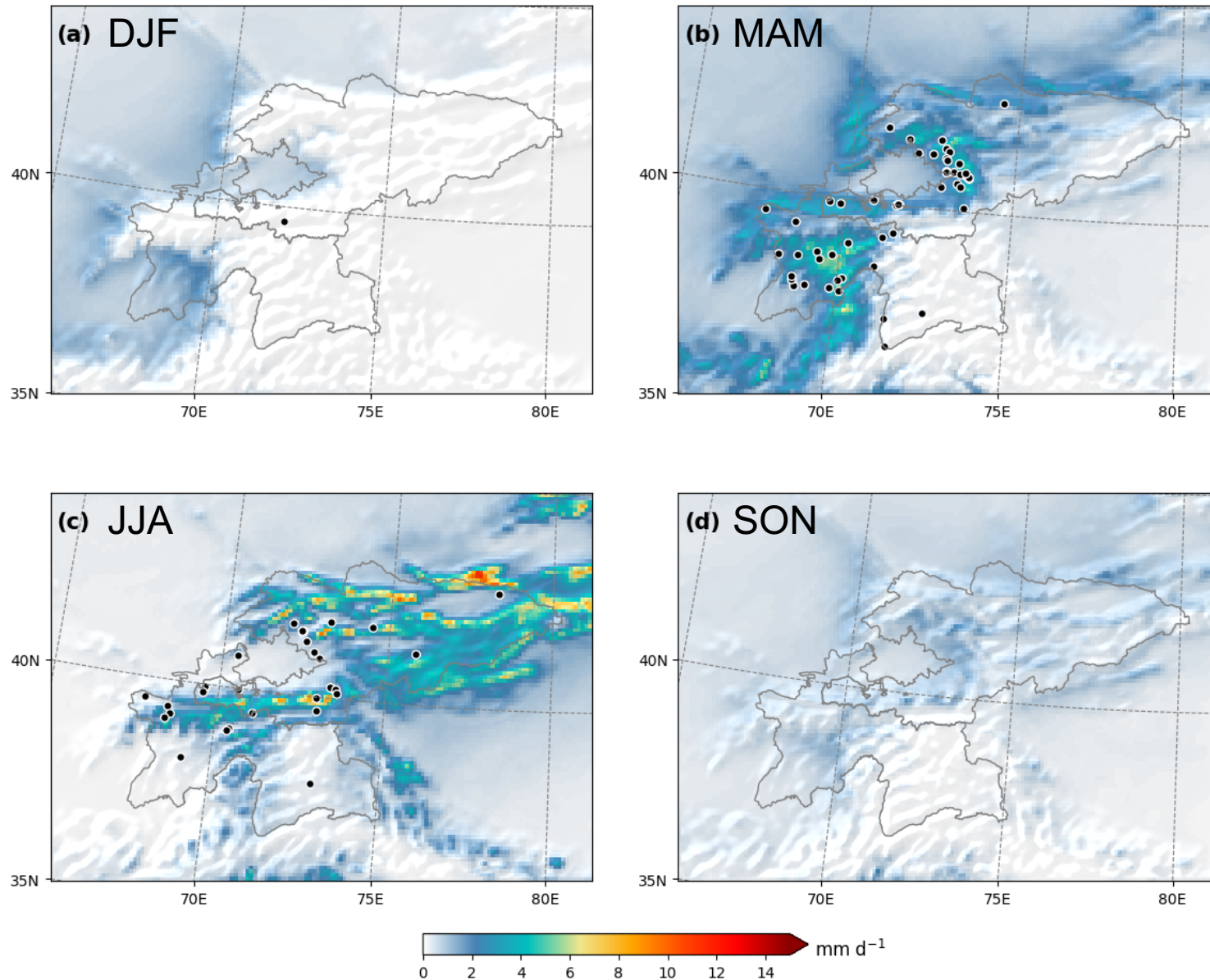

2d (surface)
3d_eta (model eta levels)
3d_pressure (pressure levels)
3d_soil (soil levels)

Landslide Catalogue

- Combine two data sets:
 - Global landslide catalogue from NASA (2007-2017)
 - Global fatal landslide database from Sheffield University (2004-2017)
 - Select landslide events in **Kyrgyzstan and Tajikistan**
 - Select landslide events within **2007-2017**
 - Select **rainfall triggered** events
 - Delete duplicate entries
- > 90 events: 79 from NASA, 11 from Sheffield

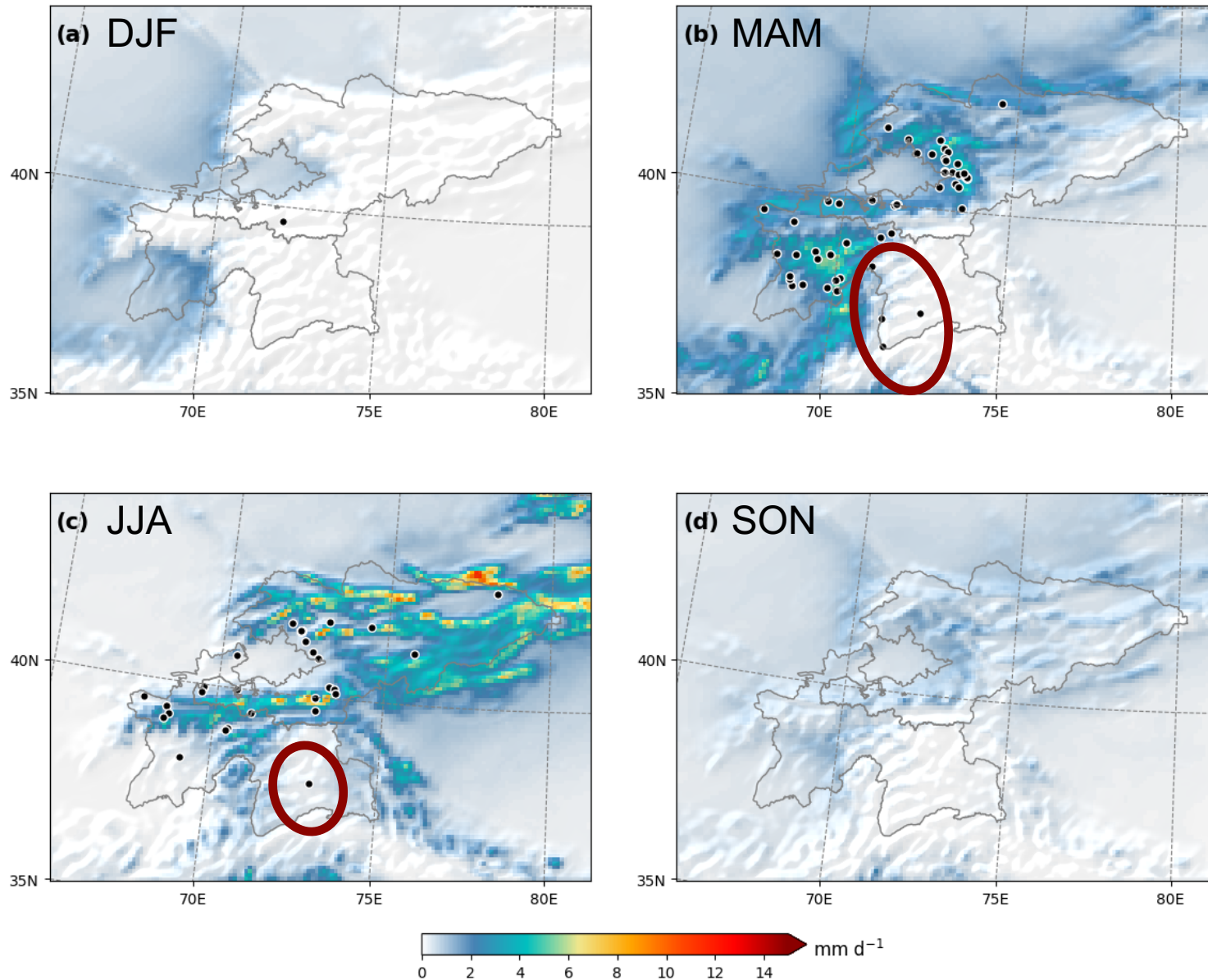


Rainfall Seasonality



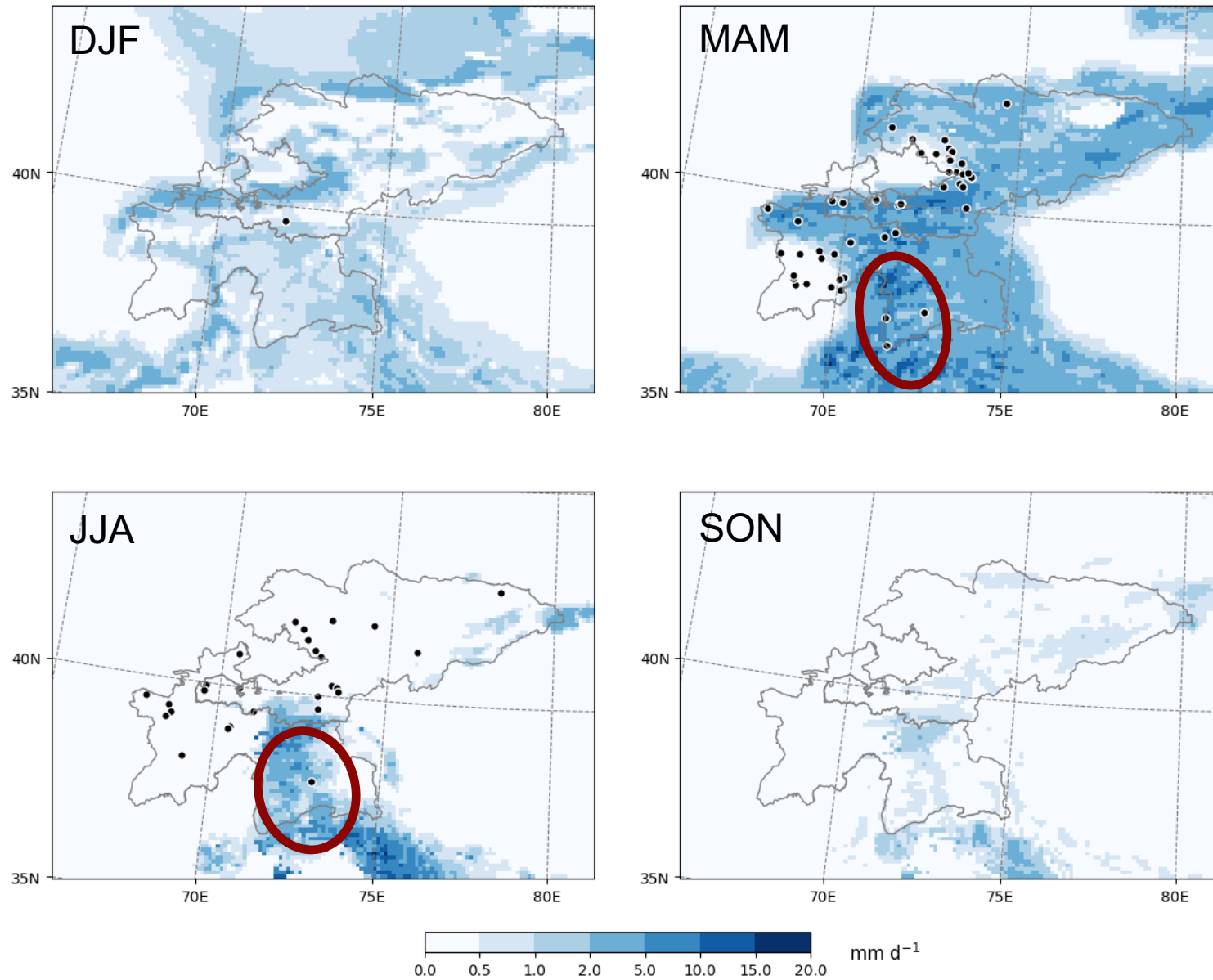
Seasonal rainfall (mm d⁻¹) in Kyrgyzstan and Tajikistan averaged over the period of 2007-2017. Black dots: landslide events.

Rainfall Seasonality



Seasonal rainfall (mm d⁻¹) in Kyrgyzstan and Tajikistan averaged over the period of 2007-2017. Black dots: landslide events.

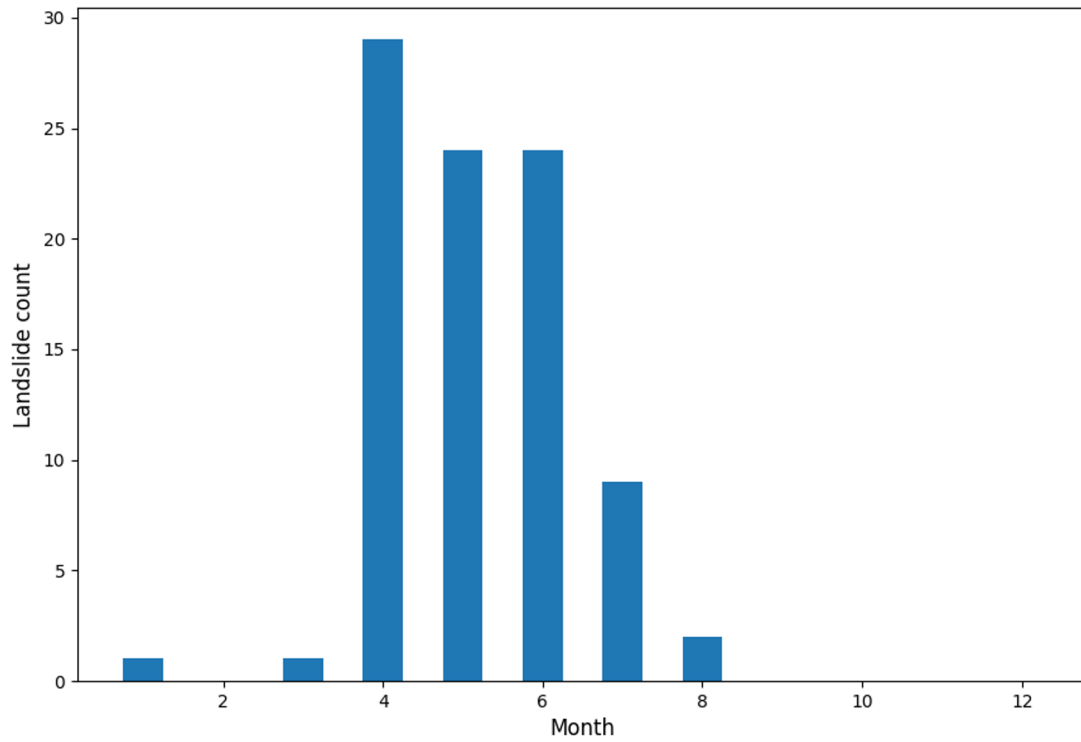
Snowmelt Seasonality



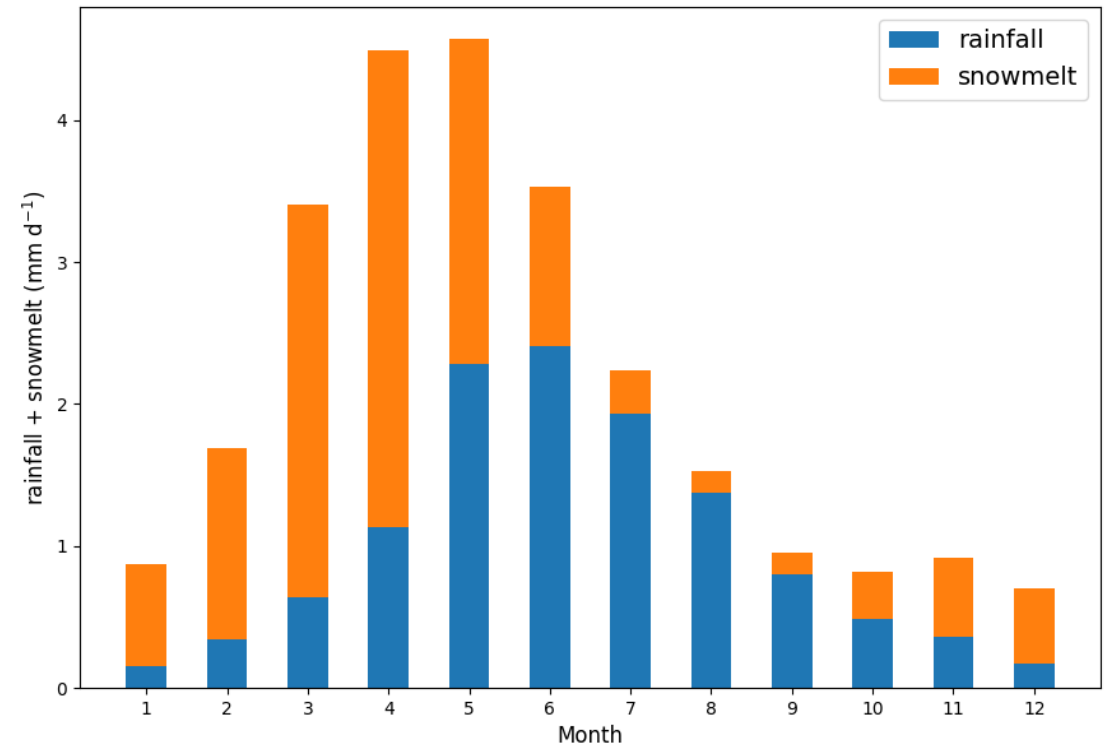
Seasonal snowmelt (mm d⁻¹) in Kyrgyzstan and Tajikistan averaged over the period of 2007-2017. Black dots: landslide events.

Snowmelt Seasonality

Monthly occurrences of landslide

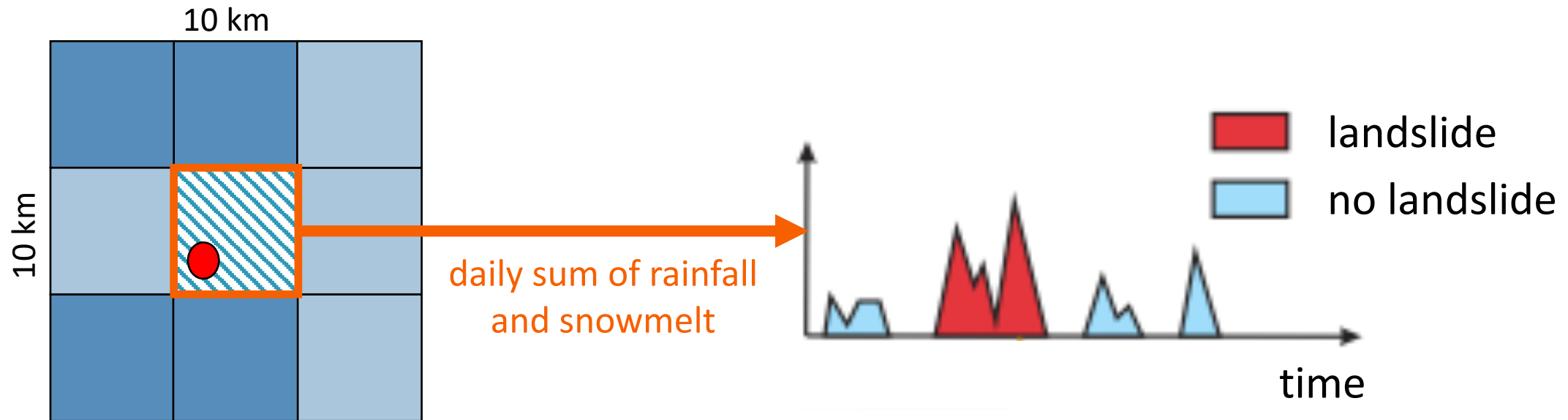


Monthly rainfall and snowmelt



Rainfall + Snowmelt Event Classification

- Select landslide events with a location accuracy ≤ 10 km -> **41 landslide events**
- Extract **time series of the daily sum of rainfall and snowmelt** from the corresponding grid cell -> **35 time series**
- For each time series, an independent event is a series of consecutive days in which more than **1 mm d^{-1}** of the sum of rainfall and snowmelt is simulated

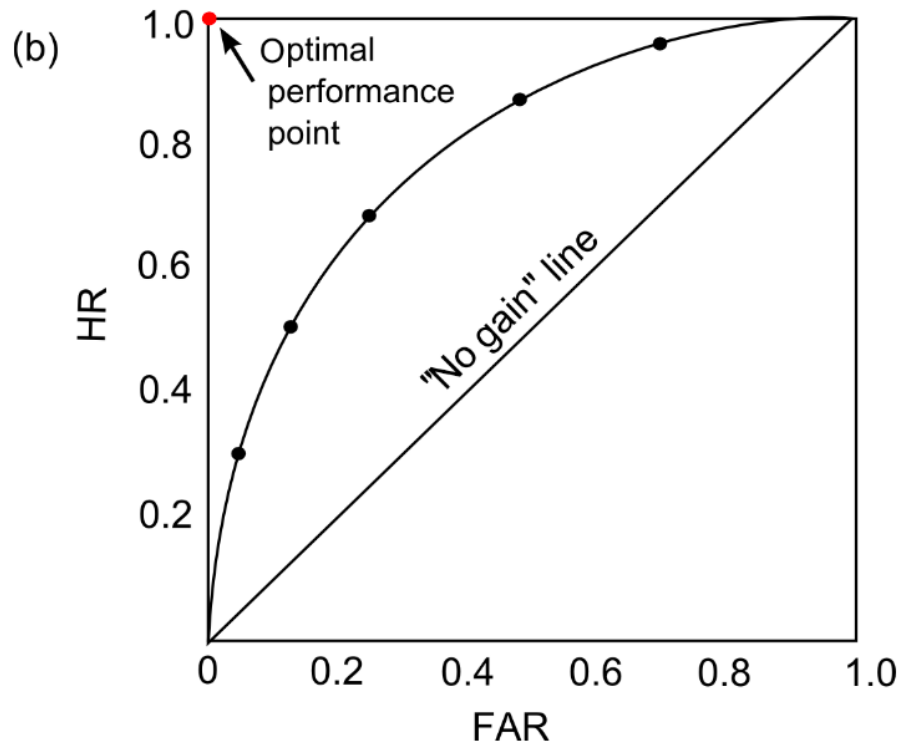


Modified after Leonarduzzi et al. (2017)

Threshold Definition

(a)

| | | Observed events | |
|------------------|-----|-----------------|----|
| | | Yes | No |
| Predicted events | Yes | TP | FP |
| | No | FN | TN |



Skill scores

- Hit rate: $HR = \frac{TP}{TP+FN}$
- False alarm rate: $FAR = \frac{FP}{FP+TN}$
- Distance to the optimal performance point:

$$d = \sqrt{(HR - 1)^2 + (FAR - 0)^2}$$

Skill Scores

| | Reconstruction percentage | Mean intensity | | | Maximum intensity | | |
|---------------------|---------------------------|---------------------------------|------|------|---------------------------------|------|------|
| | | Threshold (mm d ⁻¹) | HR | FAR | Threshold (mm d ⁻¹) | HR | FAR |
| Rainfall + Snowmelt | 77.1% | 5.6 | 0.67 | 0.31 | 8.0 | 0.70 | 0.29 |

Skill Scores

| | Reconstruction percentage | Mean intensity | | | Maximum intensity | | |
|---------------------|---------------------------|---------------------------------|------|-------------|---------------------------------|-------------|-------------|
| | | Threshold (mm d ⁻¹) | HR | FAR | Threshold (mm d ⁻¹) | HR | FAR |
| Rainfall + Snowmelt | 77.1% | 5.6 | 0.67 | 0.31 | 8.0 | 0.70 | 0.29 |
| Rainfall | 62.9% | 4.8 | 0.68 | 0.40 | 7.9 | 0.64 | 0.30 |

Conclusions

- HAR v2 is a suitable dataset for investigating climatic triggers of landslides in Central Asia
- Not rainfall alone but the sum of rainfall and snowmelt is the climatic trigger of landslides in Central Asia
- This method of threshold definition can be also applied for landslide prediction, but it needs further improvement

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