



# DEMIX

Digital Elevation Model Intercomparison eXercise  
- overview and results

---

Peter Strobl for the DEMIX team

EC-JRC

VH-RODA, ESA/ESRIN, Italy

29<sup>th</sup> November 2023



DEMIX origins from the JRC DEM benchmarking workshop (Jan 2019):

- **new data sets** are coming up (“Copernicus DEM”), which might change the DEM ‘landscape’
- EO platforms and ‘data cubes’ make data increasingly available also at **continental to global scales**
- literature is rich in **DEM validation and comparisons** of (almost) everything with everything else in many different places
- methodologies vary and results are not always **representative or comparable** between studies and locations
- **a coordinated approach is desirable!**
- **bring CEOS TMSG and the International Society for Geomorphometry (ISG) together!**



The Committee on Earth Observation Satellites (CEOS) was established in 1984 under aegis of the G7 Economic Summit of Industrial Nations Working Group on Growth, Technology, and Employment

Now in its fourth decade, CEOS comprises

- **34 Members**  
(Space Agencies) and
- **29 Associates**  
(UN Agencies, Phase A programmes or supporting ground facility programmes)

All of whom contribute to CEOS on a 'best efforts' and voluntary basis.



Mission: CEOS ensures international coordination of civil space-based Earth observation programs and promotes exchange of data to optimize societal benefit and inform decision making for securing a prosperous and sustainable future for humankind.



## CEOS WGCV mandate for DEMIX:

- perform a state-of-the-art comparison of the major global (free&open) DEMs
- provide recommendations on best available DEM options depending on domain and area to allow informed choices

## Expected Outcomes

- Consistent and comprehensive DEM definitions and terminology (t)
- Base (t) and extended (g) set of benchmarking metrics and respective algorithms (t) and open source tools (g)
- Detailed comparison results on test areas (t) and aggregated wall to wall benchmarking results (g)
- Recommendations regarding reference DEMs (t) and consistent orthoimage (g)
- Final report (t) and peer-reviewed publication (g)

(t) threshold; (g) goal

**decision in 2020**



- ❑ The CEOS Working Group on Calibration and Validation (WGCV) dedicates itself to ensure long-term confidence in the accuracy and quality of Earth Observation data and products and is the forum for exchange of information on calibration, validation, and associated cooperative activities.
  
- ❑ The WGCV has six Subgroups that operate as individual entities and focus on specific technical areas related to calibration and validation:
  - **Atmospheric Composition (ACSG)**
  - **Land Product Validation (LPV)**
  - **Infrared Visible Optical Sensors (IVOS)**
  - **Microwave Sensors (MSSG)**
  - **Synthetic Aperture Radar (SAR)**
  - **Terrain Mapping (TMSG)**

2023-2024 WGCV Chair  
 *Philippe Goryl*

2023-2024 WGCV Vice-Chair  
 *Cody Anderson*  
science for a changing world



## Status of the CEOS/WGCV Terrain Mapping SubGroup (TMSG)

- Re-activated early 2020
- as of Nov 2023:
  - ~60 subscriptions
  - 15 countries
  - ~50% with CEOS background
  - ~30% Geomorphometry.org
  - ~35 expressed interest in the intercomparison exercise DEMIX (incl. industry!)
- main activity so far is DEMIX, but more is coming
- DEMIX workshop & TMSG plenary held on 12/13 July 2023 at Geomorphometry23 in Iasi, Romania

Geomorphometry23 web page: <https://geomorphometry.org/geomorphometry-2023/>  
TMSG Subscription page: [https://ec.europa.eu/eusurvey/runner/WGCV-TMSG\\_membership](https://ec.europa.eu/eusurvey/runner/WGCV-TMSG_membership)



## CEOS WGCV mandate for DEMIX:

- perform a **state-of-the-art comparison** of the major global (free&open) DEMs
- provide **recommendations** on best available DEM options depending on domain and area to allow informed choices

**decision in 2020**

### Expected Outcomes

- **Consistent and comprehensive DEM definitions and terminology (t)**
- **Base (t) and extended (g) set of benchmarking metrics and respective algorithms (t) and open source tools (g)**
- **Detailed comparison results on test areas (t) and aggregated wall to wall benchmarking results (g)**
- Recommendations regarding reference DEMs (t) and consistent orthoimage (g)
- Final report (t) and peer-reviewed publication (g)

(t) threshold; (g) goal

after:

- 3 years,
- 3 plenaries,
- wrangling down Teams
- 3 subgroups, each with 5-15 active members,
- 130+ subgroup meetings, each with at least 4 participants
- a [conference paper](#) and [video](#),
- 2+ peer-reviewed publications,
- a new '[DEMIX tiling](#)' system,
- a processing platform, ...

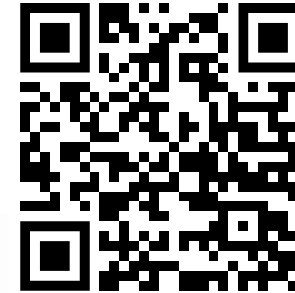


**we are almost there...**

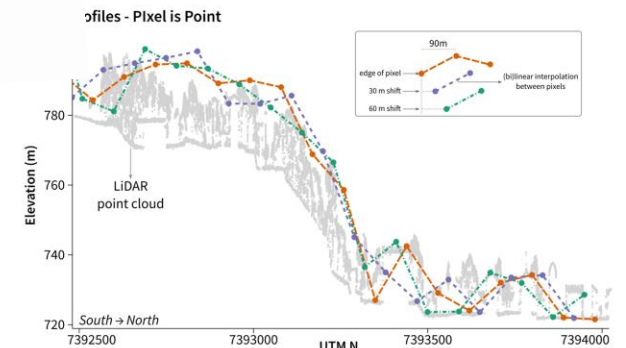
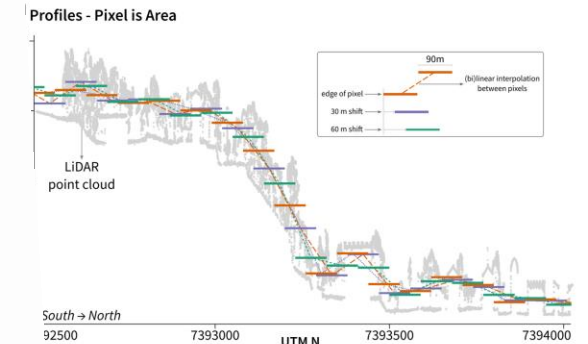
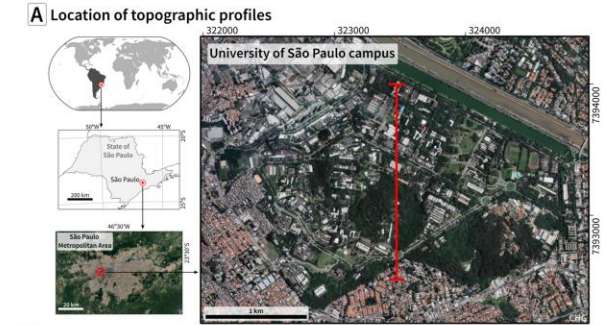




- Revised terminology and comprehensive definitions (glossary) finished
- Peer reviewed paper published:  
[Guth et. al. 2021](https://doi.org/10.3390/rs13183581)



The image shows the cover of a scientific paper. At the top left, there is a diagram illustrating the relationship between a Digital Surface Model (DSM) and a Digital Terrain Model (DTM). The DSM is shown as a dashed line representing the ground surface with trees and power lines, while the DTM is a solid line representing the ground surface without vegetation. Below this, a cross-sectional diagram shows various elevation-related features: Ice Topog, Freeboard, Ocean/Lake Surface, Geoid, Ellipsoid, Sea Level, Ice draft/keel, Bathymetry, and Subglacial Topography. The paper title is "Digital Elevation Models: Terminology and Definitions" by Peter L. Guth et al. The journal is "remote sensing" from MDPI. The DOI is <https://doi.org/10.3390/rs13183581>.





Before talking about quality we must define **criteria and metrics** which characterize a DEM and which can be used to compare them

Three main groups were identified:

1. Linear difference (or error) measures such as **RMSE, LE90, CE90, Median** and normalized median absolute difference (NMAD), separately for **horizontal displacement** and **(vertical) elevation difference**, distinguished by e.g. slope, land cover, and not generalized spatially over more than  $10^6$ - $10^7$  values
2. Morphological descriptors, e.g. **slope, aspect, roughness**. **Complex morphological metrics** like **number of peaks and pits, length of ridges and troughs, number of outliers (spikes), consistency of stream networks**
3. Other: Autocorrelation length, SNR

† non-quantitative\*:

**Completeness, availability and reliability of Metadata, visual appearance ...**

\*<https://zenodo.org/records/8030735>



- Intercomparison is only useful for (non-expert) users if in the end they get a **recommendation (or ranking)**:

*Are there significant differences and if so  
which options are better and which are worse?*

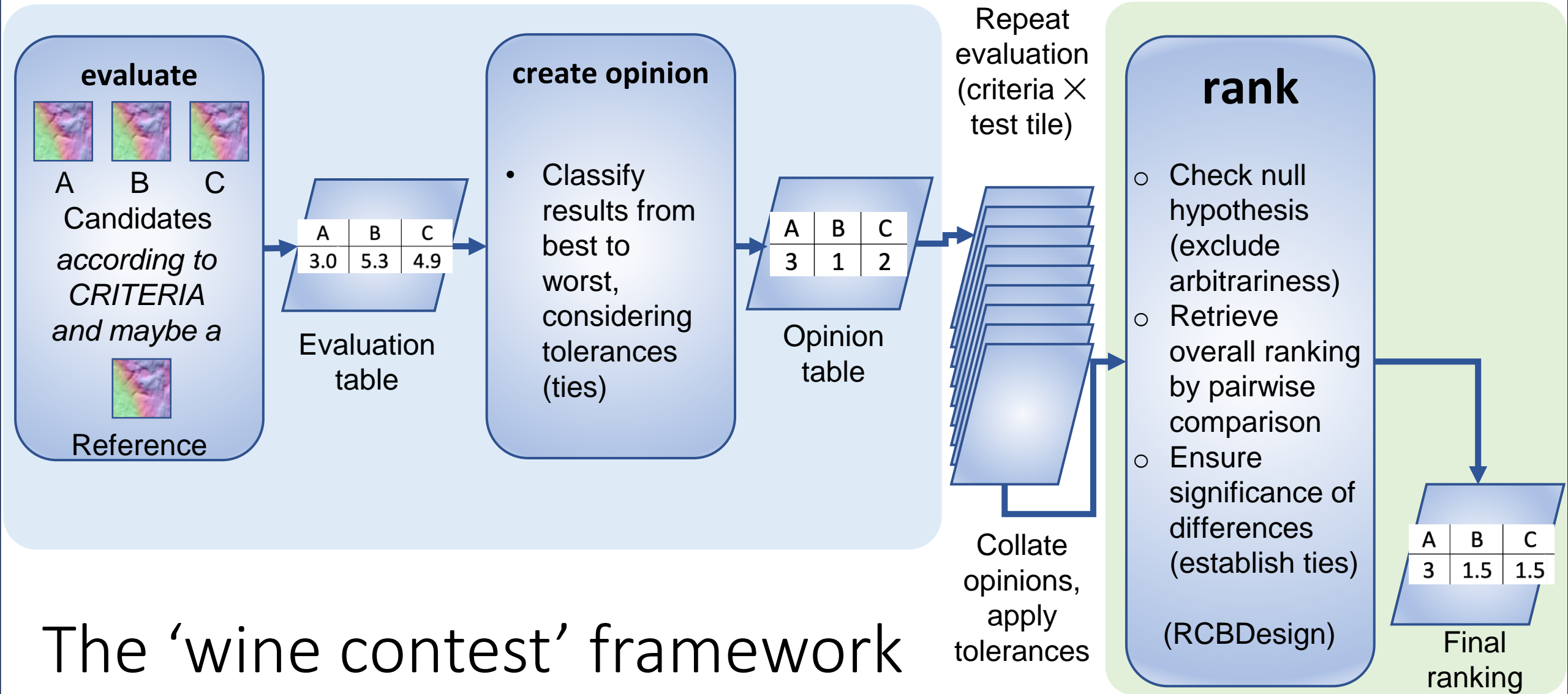
- Not every user might want to apply the same criteria and even the same criteria could result in different rankings depending e.g. on location

*We are less interested in an ‘overall winner’,  
but the best solution in a given context!*

➤ **We need a configurable, re-usable and expandible test environment!**



- A major challenge is how to combine different criteria and metrics to arrive at an overall ranking (if justifiable) of different tested DEMs
- Statisticians use the ‘**wine contest**’ method (or RCBD design) in which k different wines (candidate DEMs) are assessed according to C different criteria (metrics) by N different judges (test sites)
- allows
  - establishing of an overall ranking
  - testing the significance of the differences
  - adding, removing, and filtering candidates, metrics, and test sites



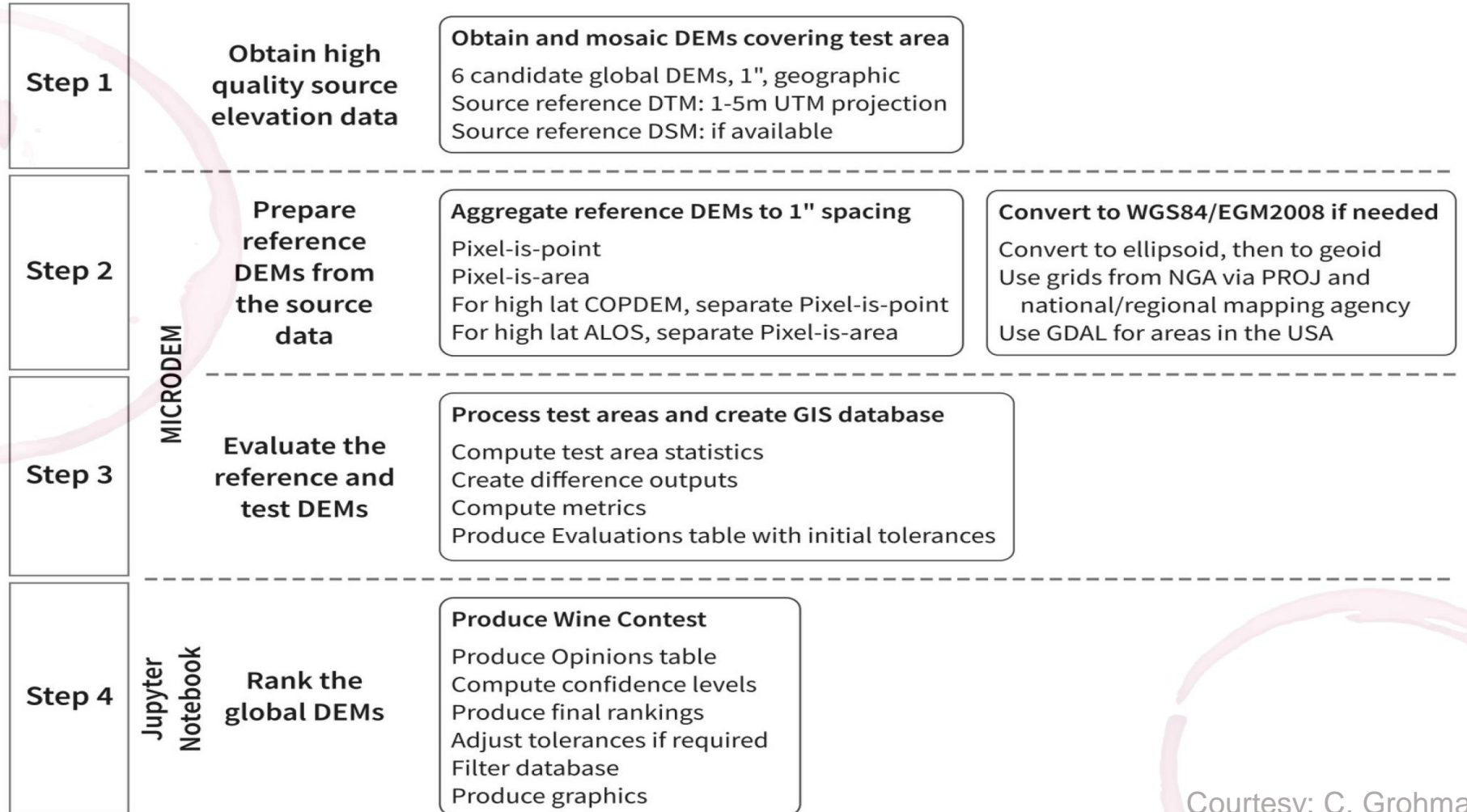
# The 'wine contest' framework

Scope and Products to be included: All datasets which have an at least continental coverage and are available under a free & open data policy, including:

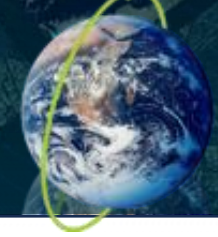
- **SRTM** (v3 NASA/CGIAR, the de-facto reference for more than a decade)
- **NASADEM** (NASA, JPL, most recent reprocessing of the SRTM product line)
- **ASTER-GDEM v3**, (METI, NASA, from ASTER stereo imagery)
- **ALOS World 3D 'AW3D30'** (JAXA, based on the PRISM stereo scanner)
- **Copernicus DEM GLO30 'COPDEM'** (EC/ESA, f&o version of WorldDEM™ procured by Airbus, the commercial version of DLR's TanDEM-X mission)
- **FABDEM**, (L. Hawker et al., UoB), DTM based on COPDEM



# WORKFLOW



Courtesy: C. Grohman



## The DEMIX wine contest:

- 24 test areas, 236 DEMIX tiles (10x10km<sup>2</sup>) on four different continents with reference data
- Reference data preparation tool
- All major geomorphological landforms and landcover types represented incl. coastal areas (partial water)
- 15 different criteria in 3 classes
- Pixel by pixel comparison against reference data
- >55.000 individual test scenarios (rows in opinions database)



Courtesy: C. Grohman





- Idea is to have a simple to use ranking tool allowing users to filter for
  - Criteria type (elevation, slope, ...)
  - Spatial characteristics (geomorphology, landcov, ...)
  - Reference (DTM or DSM)
- Ranking is recomputed according to user's purpose
- Python notebook as base (portable and cloud compatible)
- For details see:

<https://zenodo.org/records/7779256>

DEMUX\_wineContest\_SIMPLE.ipynb

File Edit View Insert Runtime Tools Help [Changes will not be saved](#)

+ Code + Text Copy to Drive

SIMPLE version of the DEMIX notebook

Carlos H Grohmann version 2022-08-11

Instructions

This is a simple version of the notebook where we only need to run 3 cells (to run, click in the cell and press shift-enter)

The first cell will download auxiliary data, functions and CSV files from GitHub, import python libraries, install the qgrid module and load a selected CSV and create the ranked dataframe.

This cell produces a lot of text output. It's safe to clear the output after it's finished

```
[ ]
```

```
[ ] # get external files - Friedman tables, custom DEMIX functions and CSV files used for the analysis
!gdown 1vptCelRj2LUYuYP9JEBnppy34CsMdc # Friedmans_tables.zip
!unzip Friedmans_tables.zip
!gdown 1nP7bUJ7d6YPeVU0X2e7fBdg4LY4f1HJ5 # demix_wine_functions.py
!gdown 1boywbg1FuDpnQe4cnL61QtVdkru9JGc5 # demix_wine_contest_matrix_18aug2022.csv
!gdown 1iGMXaxTQ7roZmRCgIgu9_f71fQ6fuoIq # hillshade_criterion.csv
!gdown 1Pr7aLbmHxETY3by1OC1cQtVRNrebMqWn # demix_wine_contest_matrix_simple_example.csv

# install qgrid, a version that works with Colab
!pip install git+https://github.com/lukewys/qgrid.git

# imports
import sys,os
import pandas as pd
```

# AWARDS



**COPDEM**

Overall best DSM



**ALOS AW3D30**

Sometimes 2nd place  
might be better in steep terrain than FABDEM



**FABDEM**

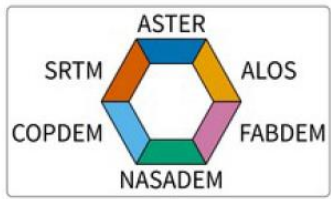
Best DTM  
(except for steep terrain)

Courtesy: C. Grohman

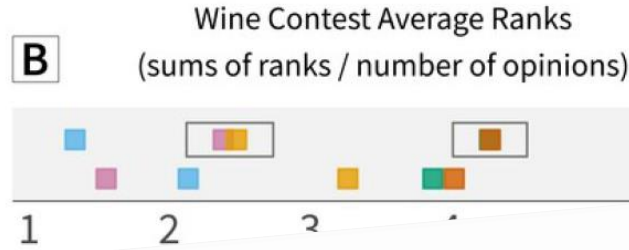
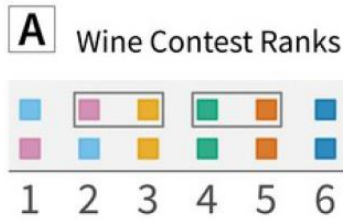


# Wine contest implemented and comprehensive intercomparison undertaken

## Peer reviewed paper submitted: Bielski et al 2023

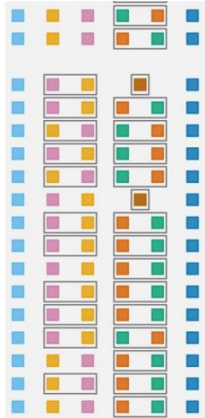


DSM - ALL (N=2010)  
 DTM - ALL (N=3540)

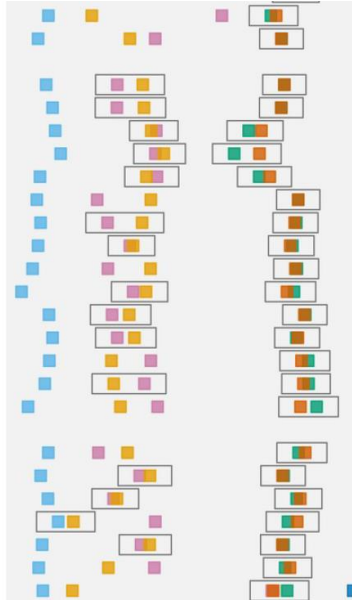


DSM - URBAN (N=1815)  
 DSM - FOREST (N=1740)

DSM - ALL pixels - ELVD\_AVD (N=134)  
 DSM - ALL pixels - ELVD\_STD (N=134)  
 DSM - ALL pixels - ELVD\_RMSE (N=134)  
 DSM - ALL pixels - ELVD\_MAE (N=134)  
 DSM - ALL pixels - ELVD\_LE90 (N=134)  
 DSM - ALL pixels - SLPD\_AVD (N=134)  
 DSM - ALL pixels - SLPD\_STD (N=134)  
 DSM - ALL pixels - SLPD\_RMSE (N=134)  
 DSM - ALL pixels - SLPD\_MAE (N=134)  
 DSM - ALL pixels - SLPD\_LE90 (N=134)  
 DSM - ALL pixels - RUFDAVD (N=134)  
 DSM - ALL pixels - RUFDAVD (N=134)  
 DSM - ALL pixels - RUFDAVD (N=134)  
 DSM - ALL pixels - RUFDAVD (N=134)  
 DSM - ALL pixels - RUFDAVD (N=134)



DSM - ALL pixels - RELIEF >= 500m (N=795)  
 DSM - ALL pixels - AVG\_SLOPE < 18° (N=1320)  
 DSM - ALL pixels - AVG\_SLOPE >= 18° (N=690)  
 DSM - ALL pixels - AVG\_ROUGH >= 10° (N=195)  
 DSM - ALL pixels - AVG\_ROUGH < 5° (N=1170)  
 DSM - ALL pixels - FOREST\_PCT >= 50% (N=540)  
 DSM - ALL pixels - URBAN\_PCT >= 25% (N=240)



IEEE TRANSACTIONS ON GEOSCIENCE AND REMOTE SENSING, VOL. XX, 2023

### Novel approach for ranking DEMs: Copernicus DEMs improve open global topography

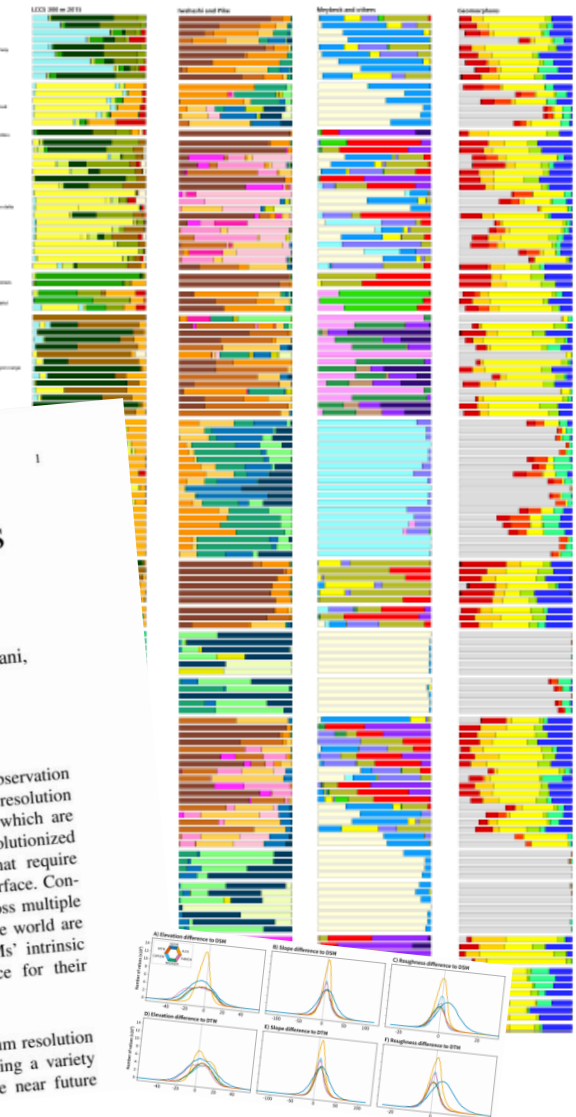
Conrad Bielski *Member, IEEE*, Carlos López-Vázquez *Senior Member, IEEE*,  
 Carlos H. Grohmann *Member, IEEE*, Peter L. Guth, Laurence Hawker, Dean Gesch, Sebastiano Trevisani,  
 Virginia Herrera-Cruz, Serge Riazanoff, Hannes I. Reuter, and Peter Strobl

<https://arxiv.org/abs/2302.08425>

**Abstract**—We present a practical approach to inter-compare a pre-range of candidate digital elevation models (DEMs) based on defined criteria and statistically sound ranking approach. The presented approach integrates the randomized complete block design (RCBD) into a novel framework for DEMs comparison. The method presented provides a flexible, statistically sound and customizable tool for evaluating the quality of any raster - in this case a DEM - by means of a ranking approach, which takes into account a confidence level, and can use both quantitative and qualitative criteria. The users can design their own criteria for the quality evaluation in relation to their specific needs. The application of the RCBD method to rank six 1" global DEMs, considering a wide set of study sites, covering different morphological and landcover settings, highlights the potentialities of the approach. We used a suite of criteria relating to the differences in the elevation, slope, and roughness distributions compared to reference DEMs aggregated from 1-5 m lidar-derived DEMs. Results confirmed significant

**OVER** the past two decades, several Earth observation missions have resulted in finer than 100 m resolution global digital elevation models (DEMs), most of which are shared freely and openly worldwide. These data revolutionized earth sciences and spurred many applications that require accurate information about the shape of Earth's surface. Consequently, the demand for high quality DEMs across multiple disciplines continues to grow and users around the world are faced with the challenge to understand the DEMs' intrinsic characteristics and to make an informed choice for their particular application.

At this time, at least six different global medium resolution (i.e., 10-100 m) DEMs have been produced using a variety of techniques. We expect more to come in the near future





# Food for discussion

## ■ Lessons learned from DEMIX?

- Clarifying terminology and concepts is worth the time, but we have just begun!
- Outside-CEOS partners are indispensable, as are sponsors!
- Careless use of grid conventions, metadata, and vertical datums are a real nightmare!

**Diversity (often) kills interoperability!**

## ■ ‘Wine contest’ for everyone?

- (Inter-)Comparisons are academic without ranking!
- Ranking is only sound if based on proper statistics!
- **BUT**, is ‘wine contest’ an appropriate name after all?



# More food...

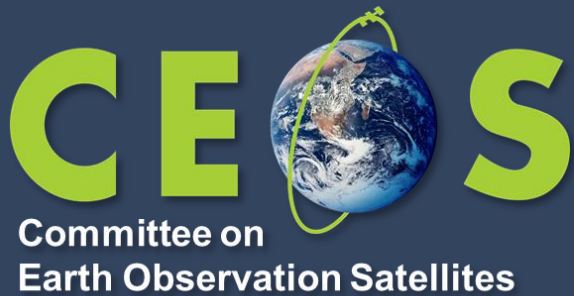
- Geolocation is a pre-requisite for spatial data interoperability
- DEMs are a key input for geolocating any non-nadir remote observation
- Co-registration (precision) is more important than absolute accuracy
- Consistency requires global references, in x, y, and z
  
- Ideas for future activities:
  - DEMIX reloaded: more criteria, more reference tiles, fully in the cloud
  - GCPIX: intercomparison of GCP libraries
  - GDMIX: spatial matching and comparison of global GCPs with (shaded) DEMs

# Thank you!

Big thanks to all active volunteers!  
In particular the sub-group leaders:

**Peter Guth, Carlos Grohman,  
Conrad Bielski, Serge Riazanoff,  
and Carlos López-Vázquez**, the wine contest mastermind!

as well as ESA (**Clement Albinet**)  
and USGS (**Dean Gesch**)  
for their support!



any questions?  
[Peter.Strobl@ec.europa.eu](mailto:Peter.Strobl@ec.europa.eu)