

Copernicus SAR Analysis-Ready Data: Products, Algorithms, and Processors

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Universitat d'Alacant
Universidad de Alicante



TU Delft



SAR Analysis Ready Data (ARD)

Objective: Develop advanced processors for a new generation of SAR products, guaranteeing easy data access while maintaining state-of-the-art scientific quality.

CSLC

Co-registered Single Look Complex

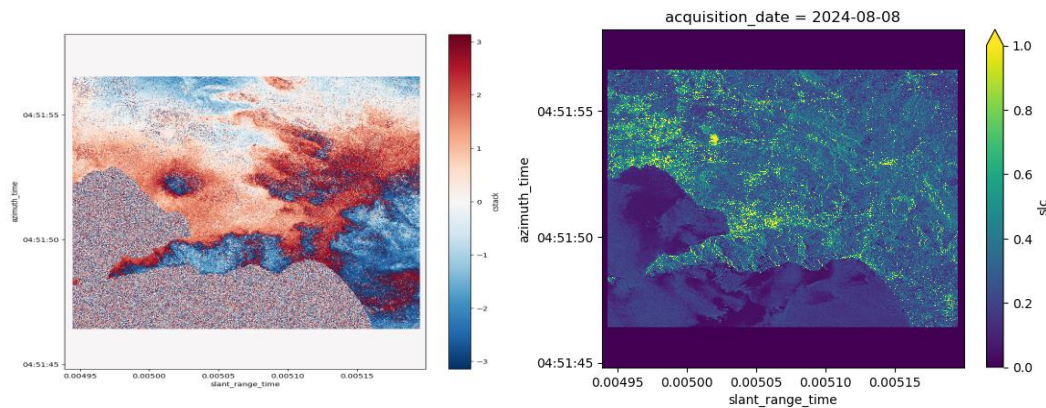
- Aligned on a common radar grid with timing corrections.
- Preserves full measurement fidelity.
- Model-based + data-driven co-registration
- Interferometry-ready foundation for generating other ARDs.

GMLP

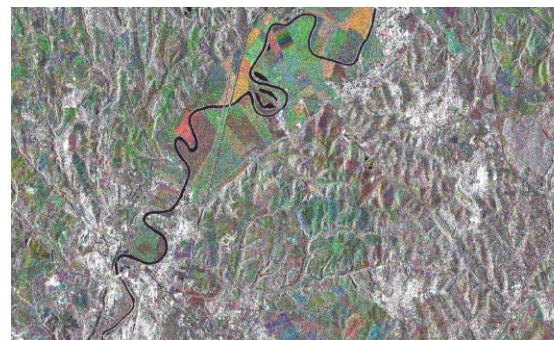
Geocoded MultiLooked Phase

- Geocoded to standard UTM coordinates (50 m posting).
- Reduces speckle and improves coherence.
- Phase consistency
- Regular updates with each 6 to 12-day acquisition.

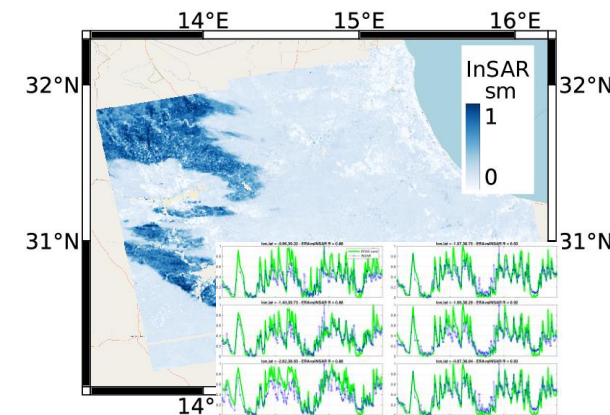
Applications



Phase & Coherence



Change detection



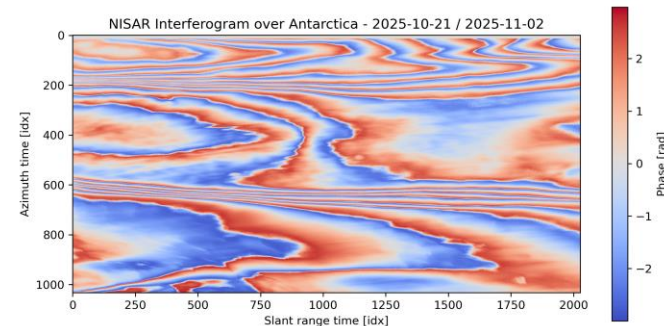
Soil moisture



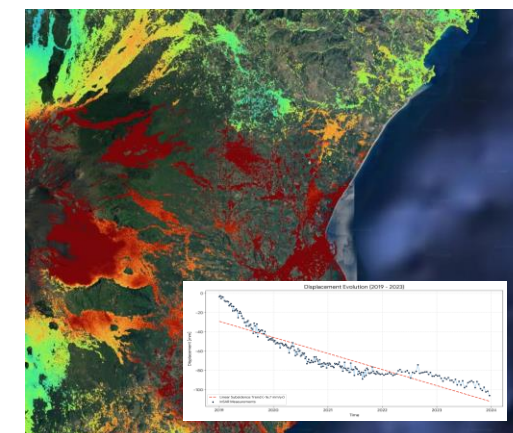
Temporal despeckling



Amplitude dispersion



Cryosphere



Persistent scatterers



Processor Implementation & Scalability

Cloud-Native Architecture

- Native Python ecosystem.
- **Xarray & Dask**: Chunked, lazy, and parallel computation.
- **Zarr**: Cloud-optimized format for highly efficient I/O.

Modularity & Extensibility

- Built for massive, systematic data volumes (**Sentinel-1, ROSE-L**).
- Pluggable framework for alternative corrections and new sensors.

Open Source Commitment

The complete processing pipeline will be released as *Open Source Software* to foster community collaboration, reproducible research, and transparent scientific validation.

Quality Analysis

Different land cover
Point/Distributed scatterers

Artificial reflectors

- Co-registration accuracy
- Resolution
- ISLR/PSLR

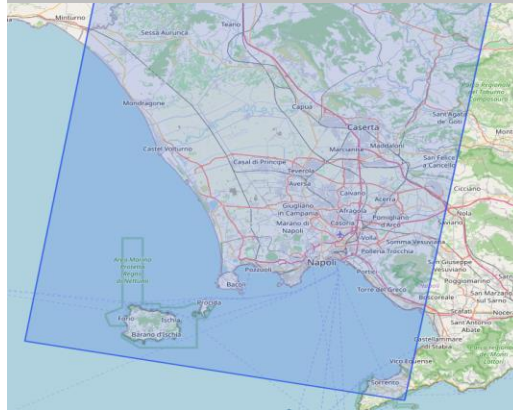
Burst overlap

- Residual azimuth shift
- Phase continuity

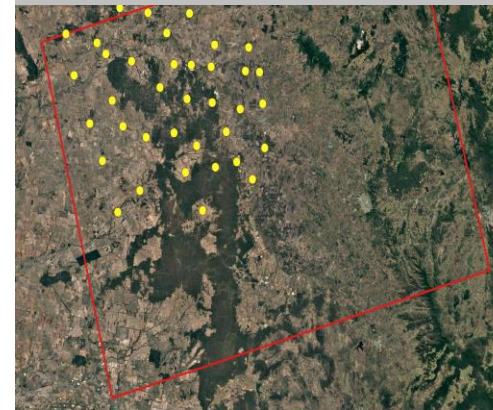
Persistent scatterers

- Phase drift in long time-series

Campi Flegrei, Italy
SAOCOM, S4,
2020 - 2025



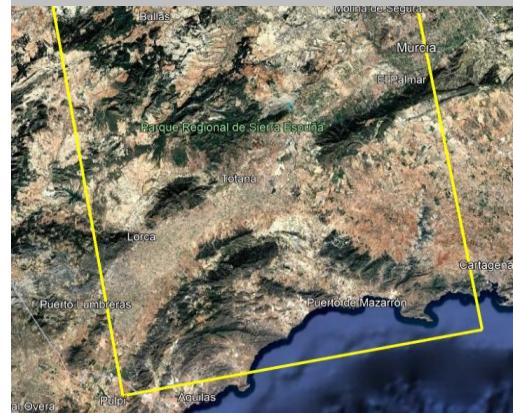
Surat Basin, Australia
Sentinel-1A, Track 111,
2024



Milan, Italy
Sentinel-1C, Track 15,
2025 - 2026



Murcia, Spain
SAOCOM, S4,
2023 - 2026



Le Mans, France
Sentinel-1C, Track 132,
2025



Common Reference Grid



The Problem: Sentinel-1 and ROSE-L share orbits, but their native bursts are not comparable.



Proposed solution: A unified radar reference grid that projects and resamples every burst from both sensors onto a shared coordinate system.



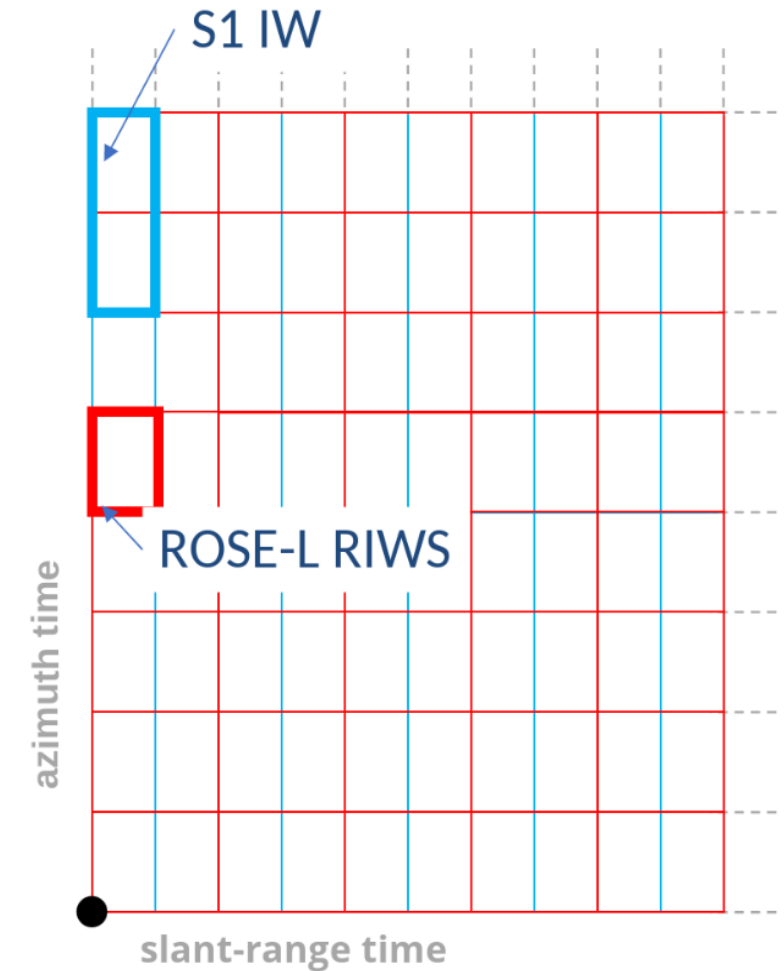
Anchor Node: Uses a single shared point.



Spacing Optimization: Grid intervals are mathematically optimized to preserve the finest resolution of each sensor, with an integer ratio constraint.



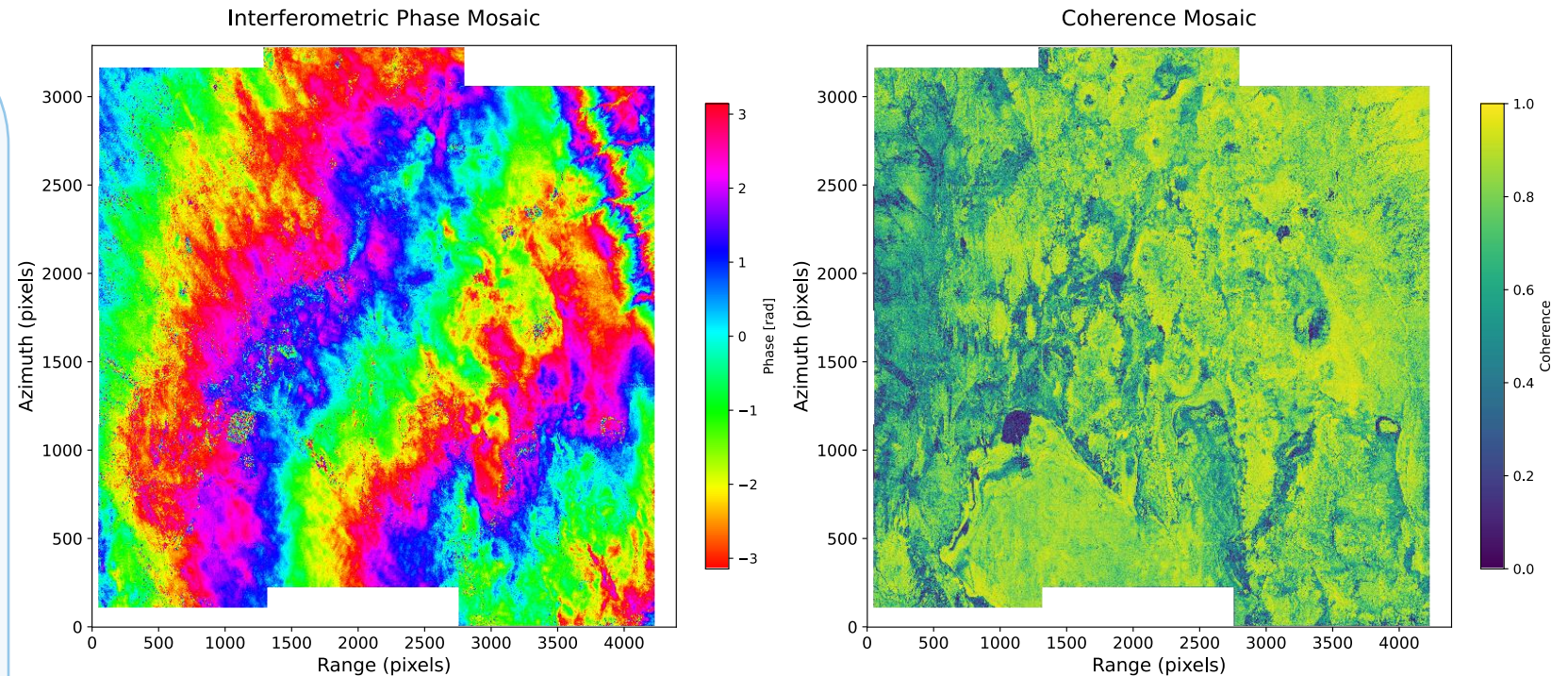
Grid size: defined starting from the expected footprint, the reference orbit, and the application of zero-Doppler equations.



Model-based Co-registration

Geometric Alignment

- Uses DEM, orbital data, and timing corrections (ETAD).
- Applied independently on each individual burst.
- Generally sufficient for C-band sensors like the **Sentinel-1** mission.
- Small residual phase discontinuities between bursts can be easily recovered through ESD.



S1C Atacama: 2025-09-18 vs 2025-12-11

Why data-driven ...

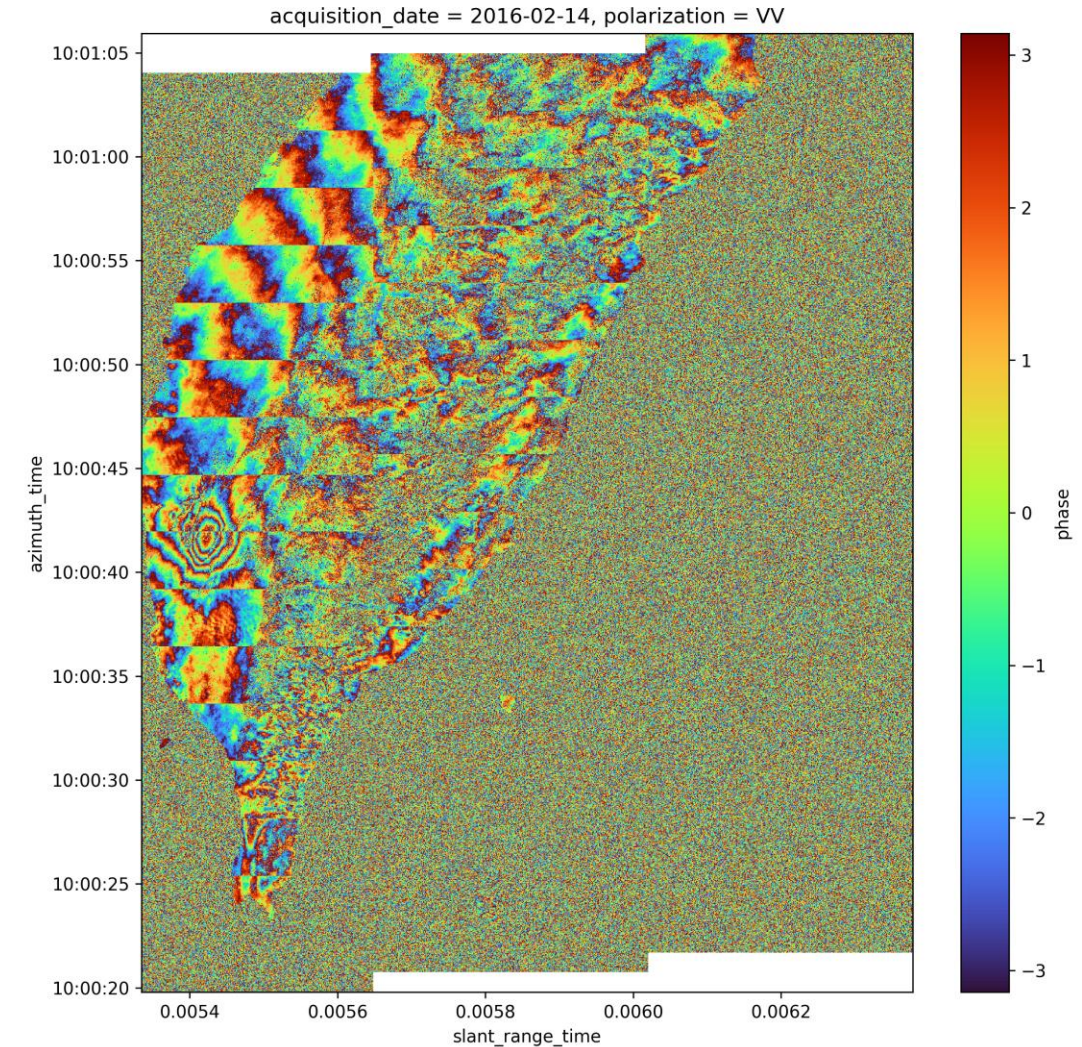
Signal offsets in L-Band are 18x larger than in C-Band.

Required to achieve sub-pixel accuracy and phase continuity in L-Band.

Taiwan: 2016-02-02 vs 2016-02-14

Model-Based Co-registration

Residual phase ramp + phase discontinuities

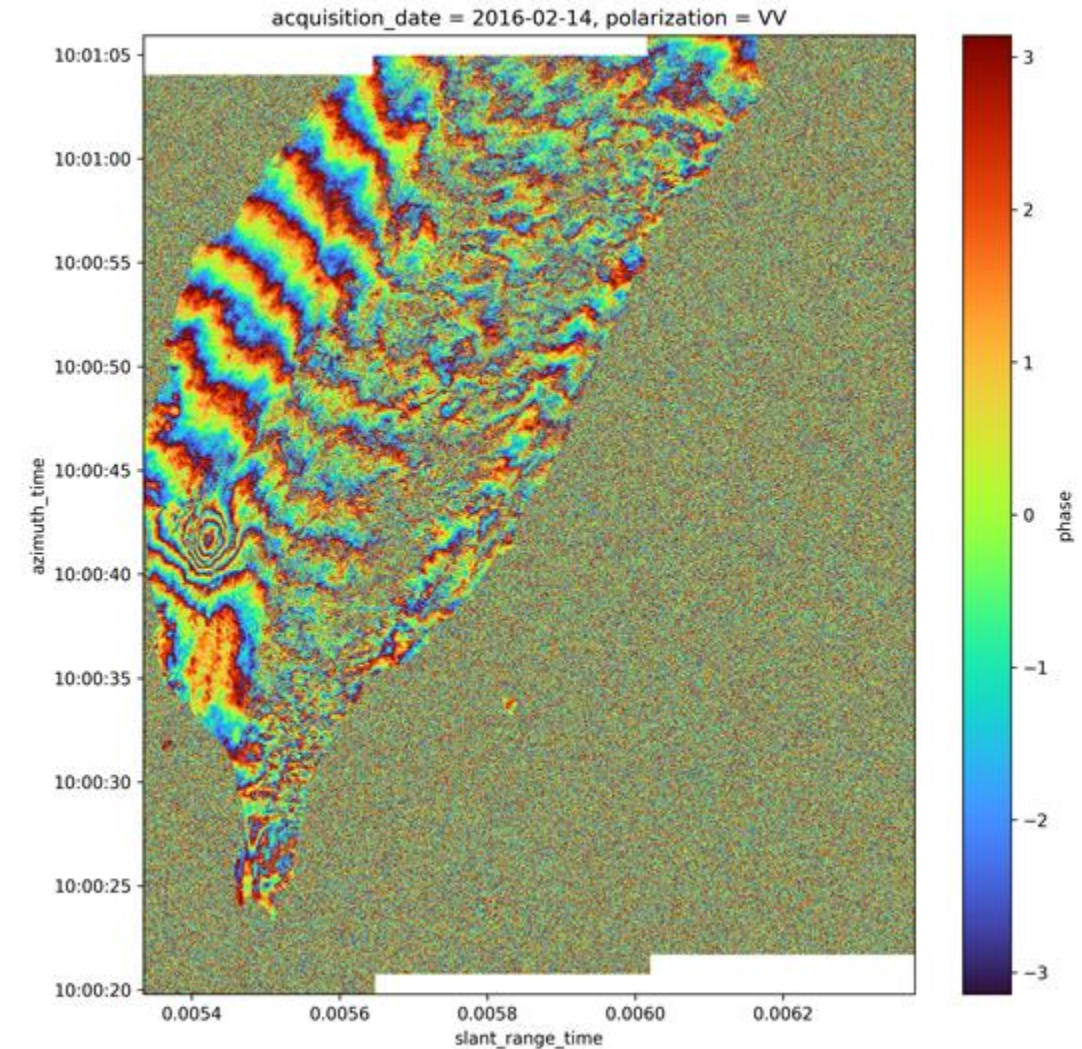


Why data-driven ...

Taiwan: 2016-02-02 vs 2016-02-14

Image Matching & ESD: Refines range and azimuth alignment to absolute sub-pixel precision.

Residual phase ramp

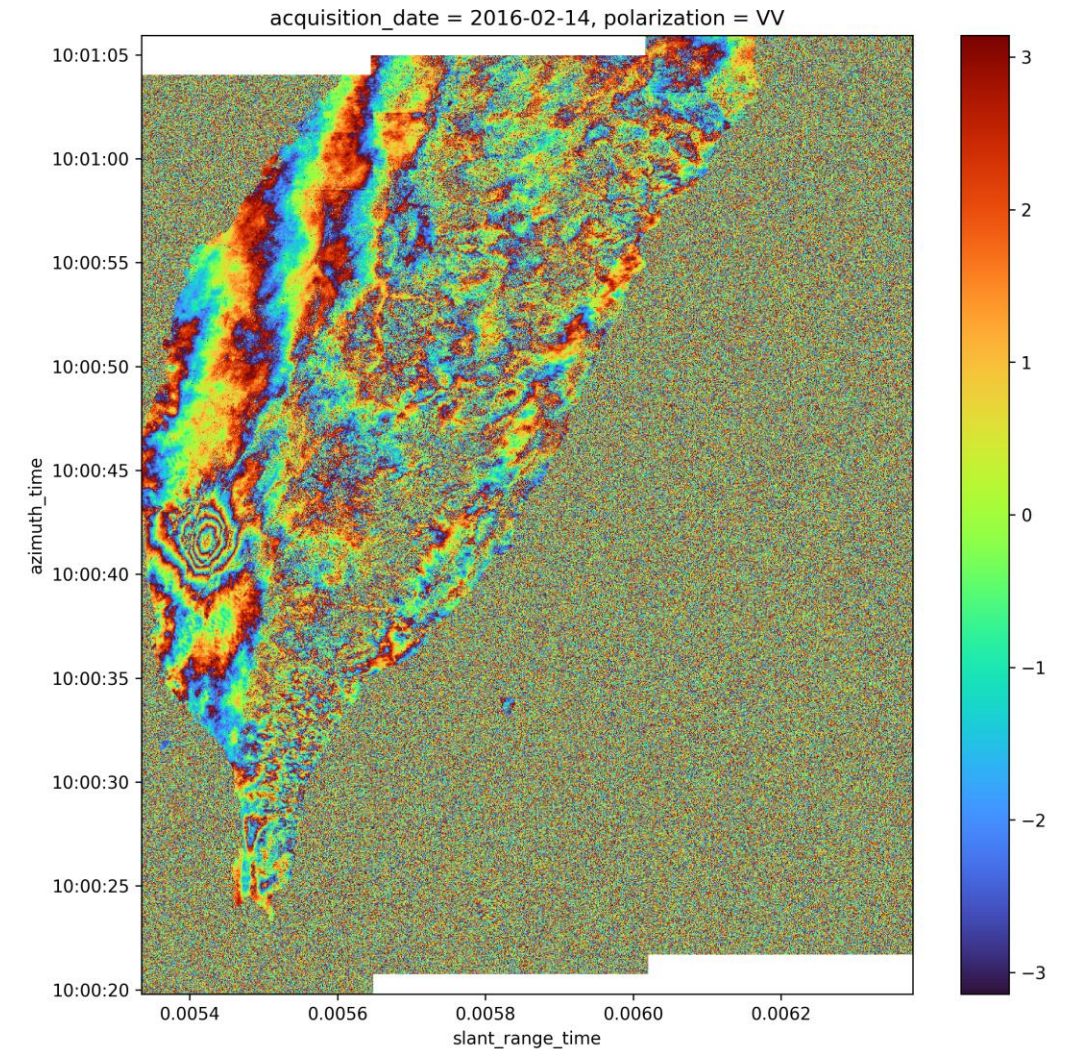


Why data-driven ...

Taiwan: 2016-02-02 vs 2016-02-14

Image Matching & Split-Spectrum: Corrects ionospheric phase screens.

Corrected phase



CSLC Data Structure

Main Variables

- **cslc**: The coregistered Single Look Complex measurements.
- **phase_model**: Model-based phase corrections (e.g., from DEM and orbit).
- **phase_iono**: Ionospheric phase screen estimations.
- **phase_tropo**: Tropospheric phase delay components.
- **phase_lowres**: Phase contributions due to tides and system corrections.

xarray.Dataset

► Dimensions: (polarization: 2, acquisition_date: 54, azimuth_time: 1495, slant_range_time: 21825)

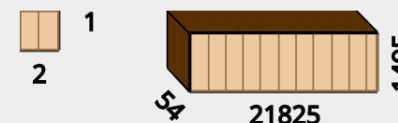
▼ Coordinates:

polarization	(polarization)	<U2	'V'	
acquisition_date	(acquisition_date)	object	'2'	
azimuth_time	(azimuth_time)	datetime64[ns]	1'	
slant_range_ti...	(slant_range_time)	float64	0.'	

▼ Data variables:

cslc	(polarization, acquisition_date, azimuth_time, slant_ran...	complex64	d.'	
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	Array	Chunk
Bytes	26.25 GiB	23.36 MiB
Shape	(2, 54, 1495, 21825)	(1, 1, 1495, 2048)
Dask graph	1188 chunks in 1 graph layer	
Data type	complex64 numpy.ndarray	



phase_model	(polarization, acquisition_date, azimuth_time, slant_ran...	float64	d.'	
phase_iono	(polarization, acquisition_date, azimuth_time, slant_ran...	float32	d.'	
phase_tropo	(polarization, acquisition_date, azimuth_time, slant_ran...	float32	d.'	
phase_lowres	(polarization, acquisition_date, azimuth_time, slant_ran...	float32	d.'	

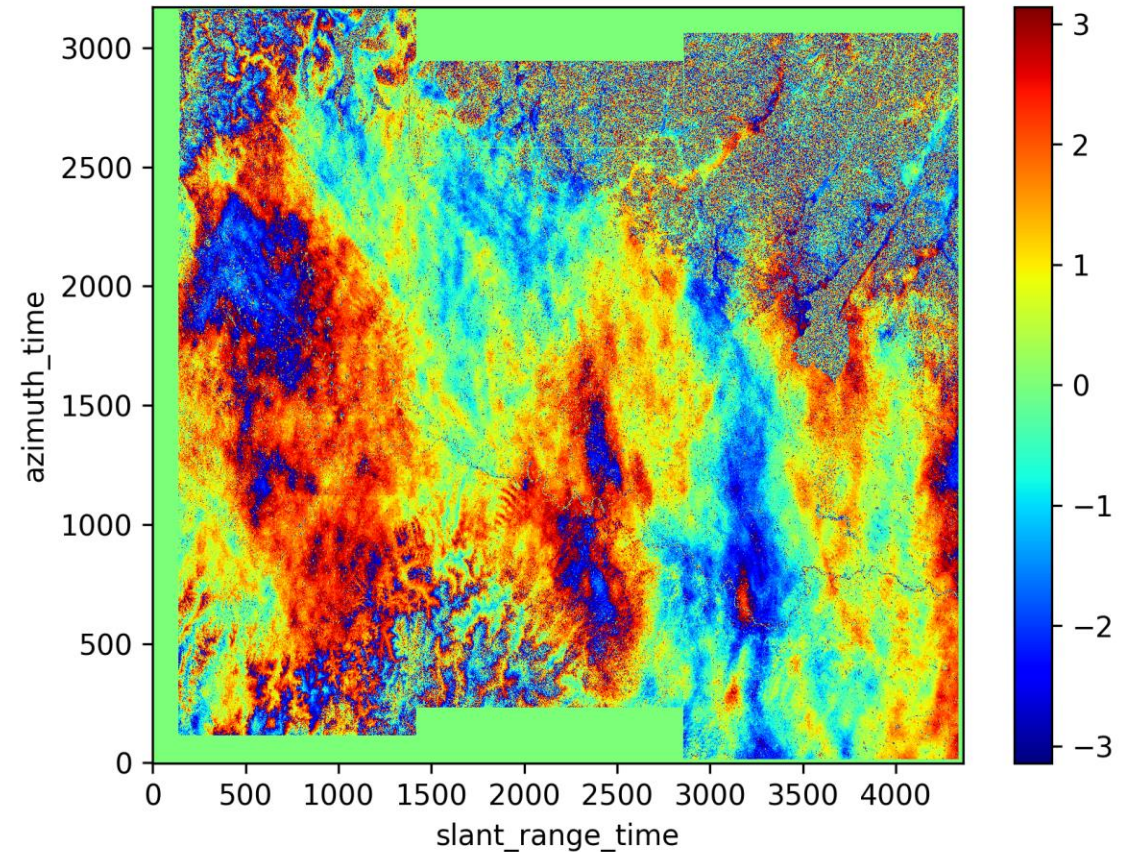
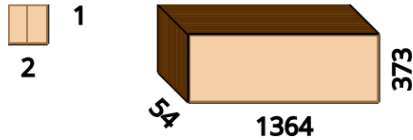
How to Use CSLC: interferometry

```
multilook = {"azimuth_time": 4, "slant_range_time": 16}
reference = coreg.sel(acquisition_date=reference_date)
interf = (
    (coreg.cslc * reference.cslc.conj())
    .coarsen(multilook, boundary="trim")
    .mean()
    .chunk({"slant_range_time": 2048, "azimuth_time": 2048})
)
phase = xr.apply_ufunc(np.angle, interf, dask="parallelized")
phase
```

✓ 0.3s

xarray.DataArray 'cslc' (polarization: 2, acquisition_date: 54, azimuth_time: 373, slant_range_time: 1364)

	Array	Chunk
Bytes	209.61 MiB	1.94 MiB
Shape	(2, 54, 373, 1364)	(1, 1, 373, 1364)
Dask graph	108 chunks in 15 graph layers	
Data type	float32 numpy.ndarray	



... Temporal filtering

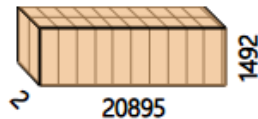
A single operation to compute the geometric mean over all the stack of co-registered images

```
n_dates = coreg.acquisition_date.size
gmean_amp = np.abs(coreg.cstack).prod(dim='acquisition_date')**(1/n_dates)
gmean_amp
```

Last executed at 2026-06-08 14:43:03 in 44ms

xarray.DataArray 'cstack' (polarization: 2, azimuth_time: 1492, slant_range_time: 20895)

	Array	Chunk
Bytes	237.85 MiB	11.66 MiB
Shape	(2, 1492, 20895)	(1, 1492, 2048)
Dask graph	22 chunks in 10 graph layers	
Data type	float32 numpy.ndarray	

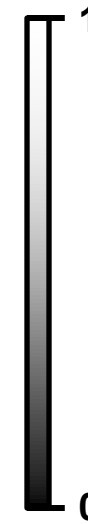


▼ Coordinates:

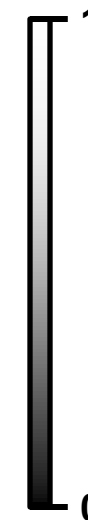
polarization	(polarization)	<U2 'VV' 'VH'	
azimuth_time	(azimuth_time)	datetime64[ns] 2016-02-02T10:00:19.695196962	
slant_range_time	(slant_range_time)	float64 0.005332 0.005332 ... 0.005657	



Reference image intensity



Temporal despeckling
(+200 images)

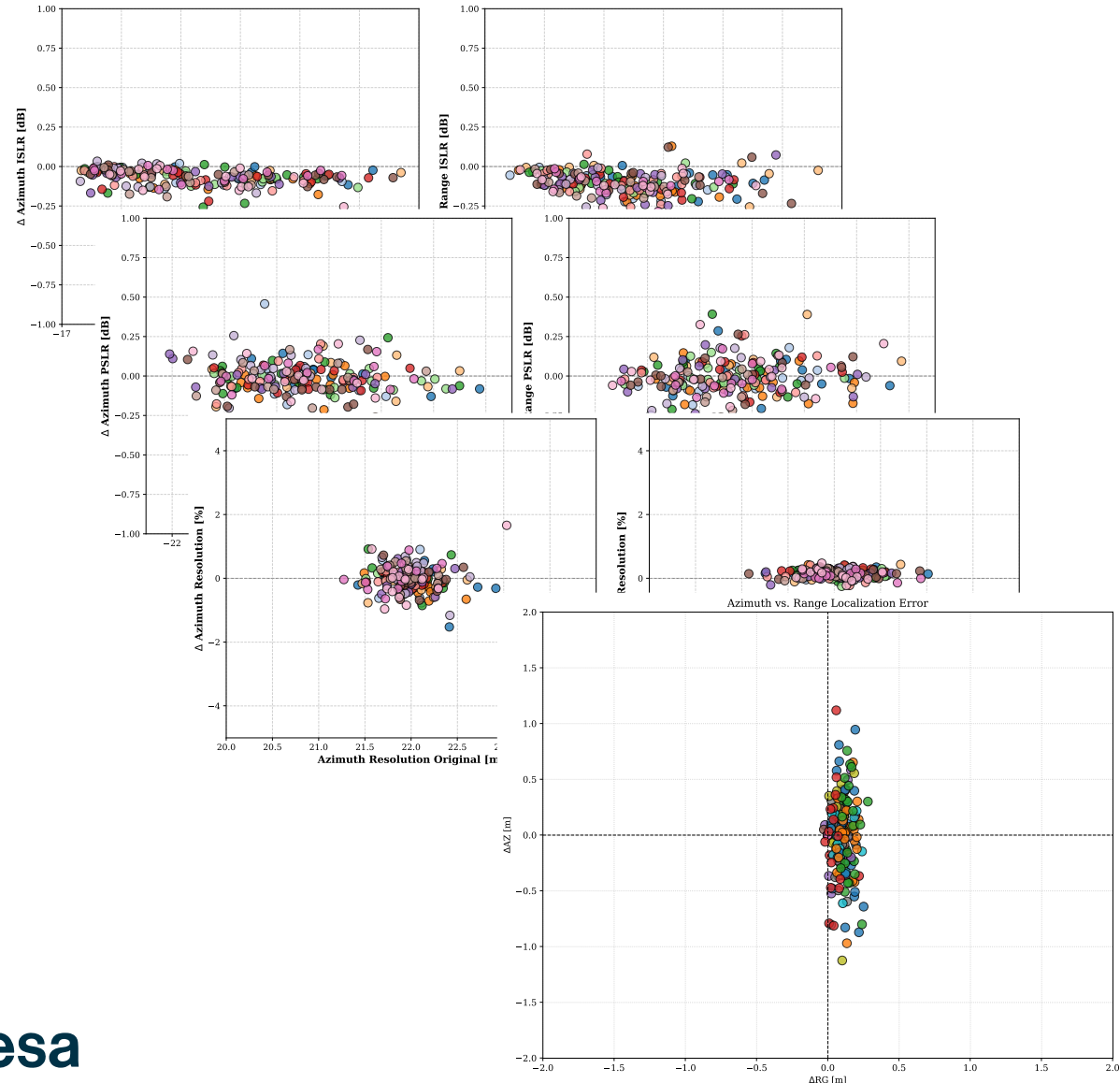


CSLC Quality Analysis (ISLR, PSLR, Resolution)

The processor ensures that all Radar **Figures of Merit** remain unchanged and **consistent** with the original input Level-1 SLC product.

Consistent with S-1 Annual Performance Report for 2024

<https://sar-mpc.eu/product-performances>



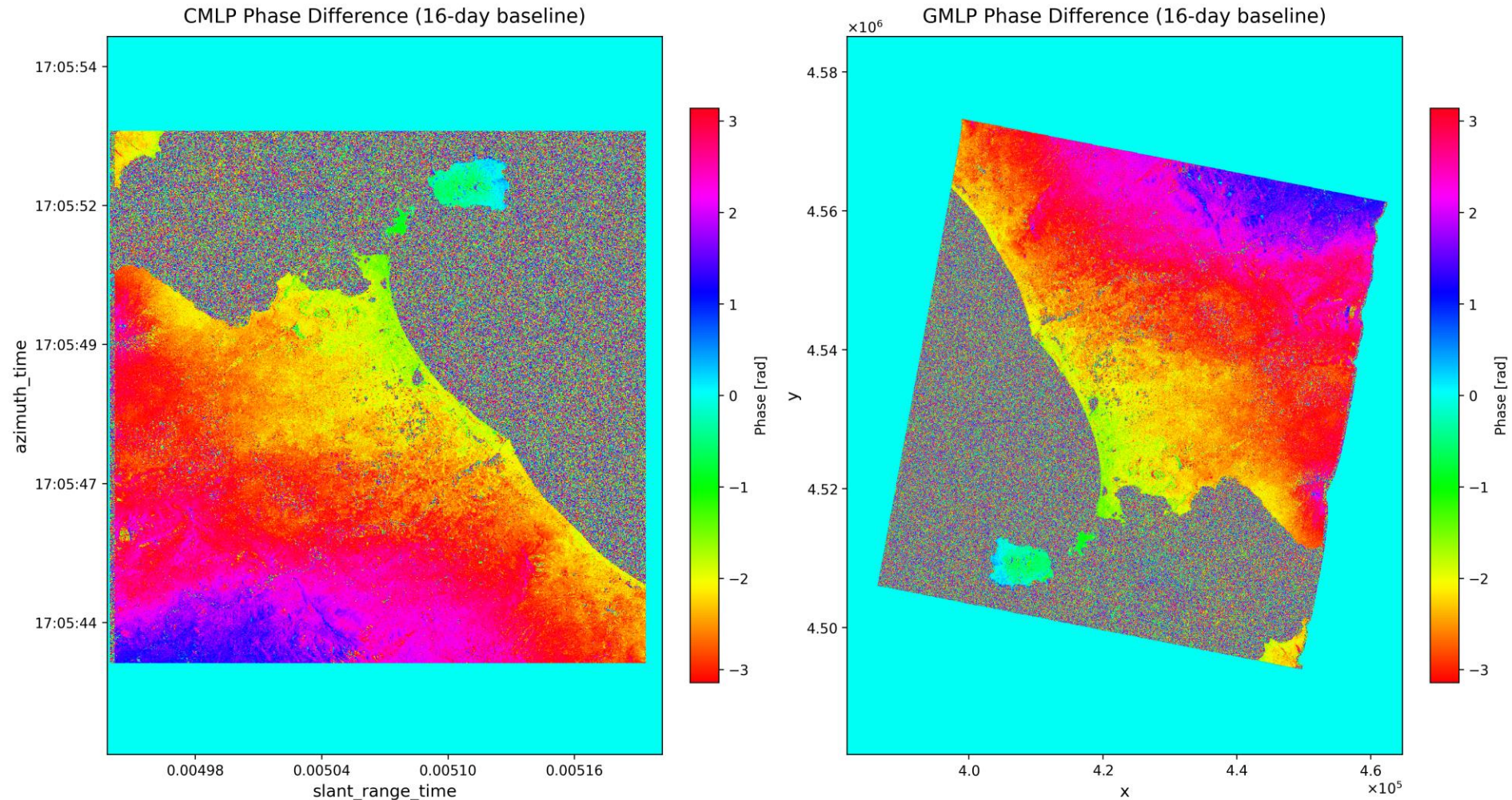
GMLP Key concepts

- Simplify interferometric processing for both single interferometric pairs and full time-series
- Provide consistent MultiLooked interferometric phase, with a drift-correction mechanism
- Data reduction (e.g. 50x)
- Fast update in correspondence of each new acquisition without need for full-stack reprocessing
- It contains some coherence layers to assist further processing (e.g. unwrapping)

F. De Zan, "Recursive and robust InSAR Phase Estimation," *EUSAR 2022; 14th European Conference on Synthetic Aperture Radar*, Leipzig, Germany, 2022, pp. 1-5.

Interferometric Phase

Naples DSC S4 2020-2025

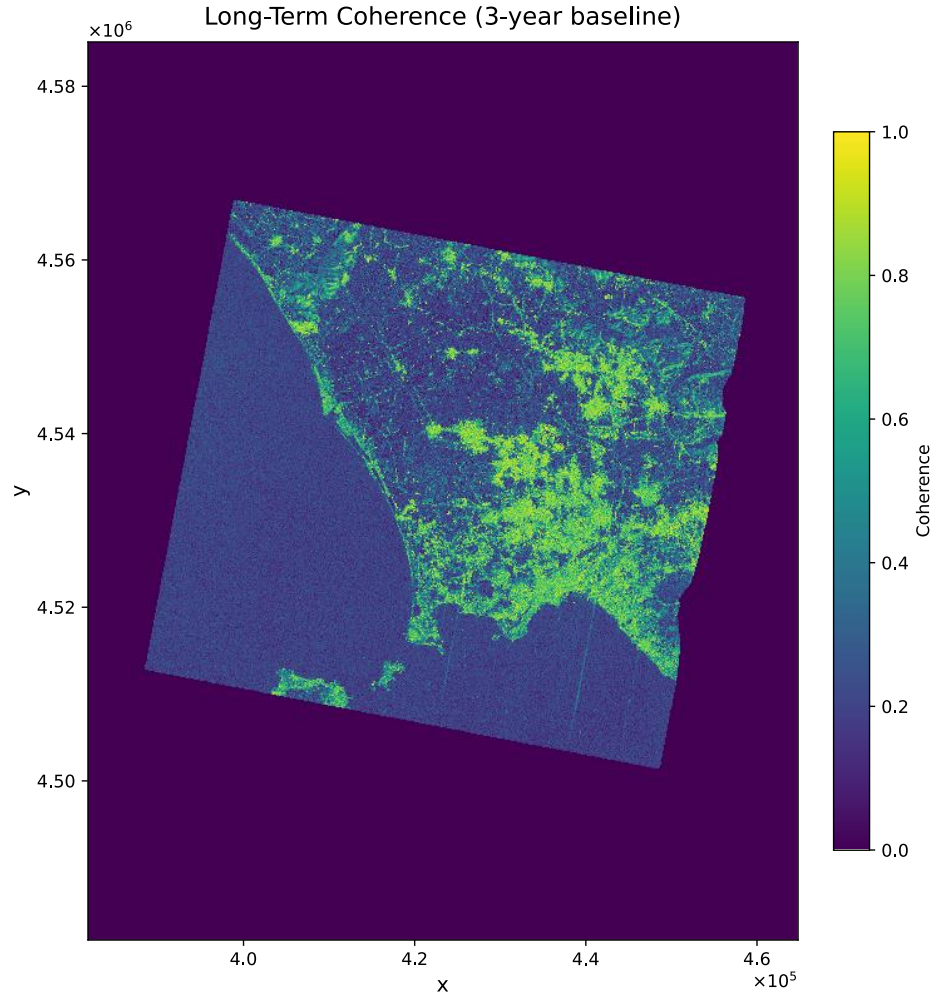


Long-term Coherence

It is one of the quality layers that accompanies the phase layer

It provides an indication of the reliability of long-temporal baseline phase measurements

It provides information that can be exploited for classification



GMLP Data Structure

Main Variables

- **phase**: Geocoded multi-look phase.
- **short_term_coh**: Short-term coherence with the current reference.
- **long_term_coh**: Long-term coherence with past references.

xarray.Dataset

► Dimensions: (acquisition_date: 1, polarization: 2, y: 1435, x: 3175, past_reference_date: 3)

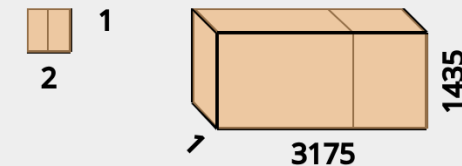
▼ Coordinates:

acquisition_date	(acquisition_date)	<U10 '2025-1...	 
polarization	(polarization)	<U2 'VV' 'VH'	 
y	(y)	float64 6.842e+...	 
x	(x)	float64 6.141e+...	 
past_reference...	(past_reference_date)	<U10 '2022-1...	 

▼ Data variables:

phase	(polarization, acquisition_date, y, x)	float32	dask.ar...	 
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	Array	Chunk
Bytes	34.76 MiB	11.21 MiB
Shape	(2, 1, 1435, 3175)	(1, 1, 1435, 2048)
Dask graph	4 chunks in 2 graph layers	
Data type	float32 numpy.ndarray	



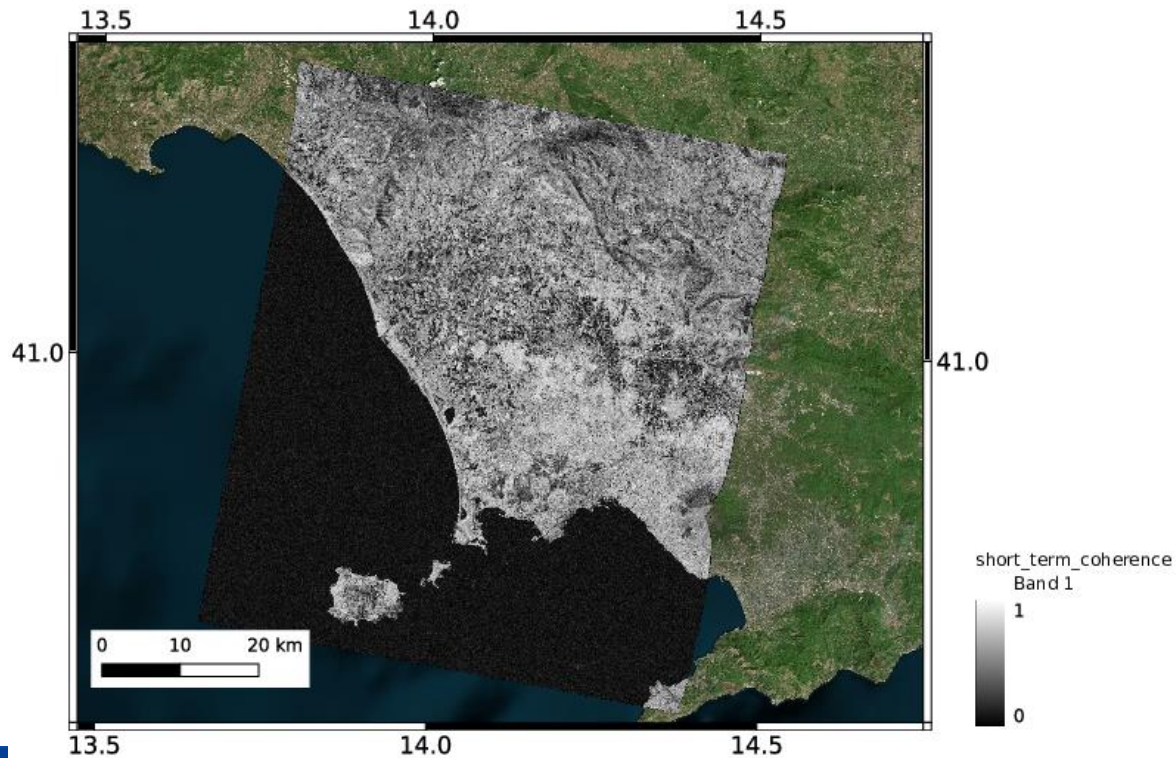
short_term_coh	(polarization, acquisition_date, y, x)	float32	dask.ar...	 
long_term_coh	(polarization, acquisition_date, past_reference_date, y, x)	float32	dask.ar...	 

How to Use GMLP

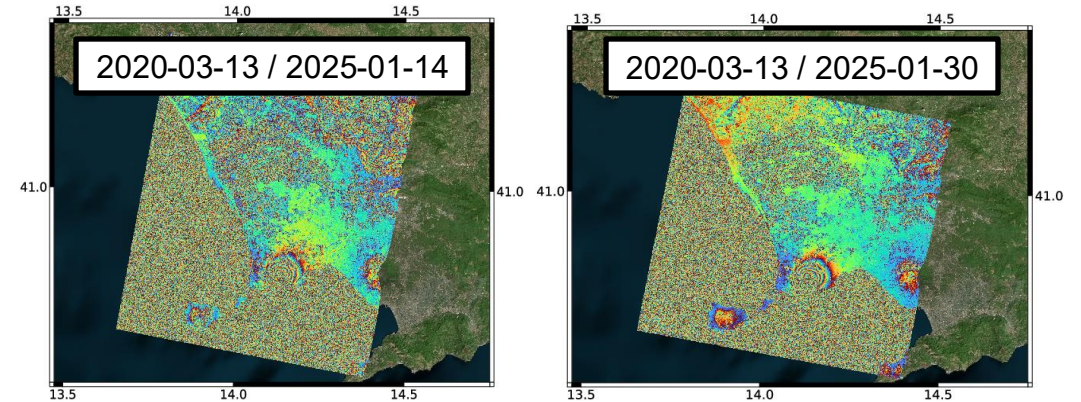
- Computing arbitrary interferograms directly in GIS

$$\varphi = \text{atan2}(\sin(\phi), \cos(\phi)) = 2 \text{atan}\left(\frac{\sin(\phi)}{1 + \cos(\phi)}\right)$$

Good short-term coherence

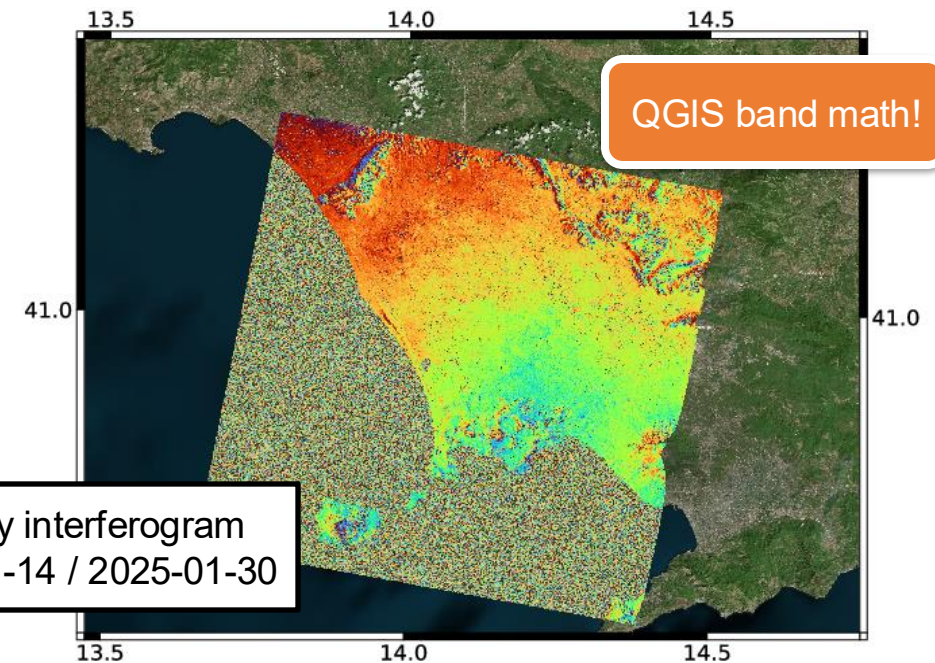


2x 5-year interferograms



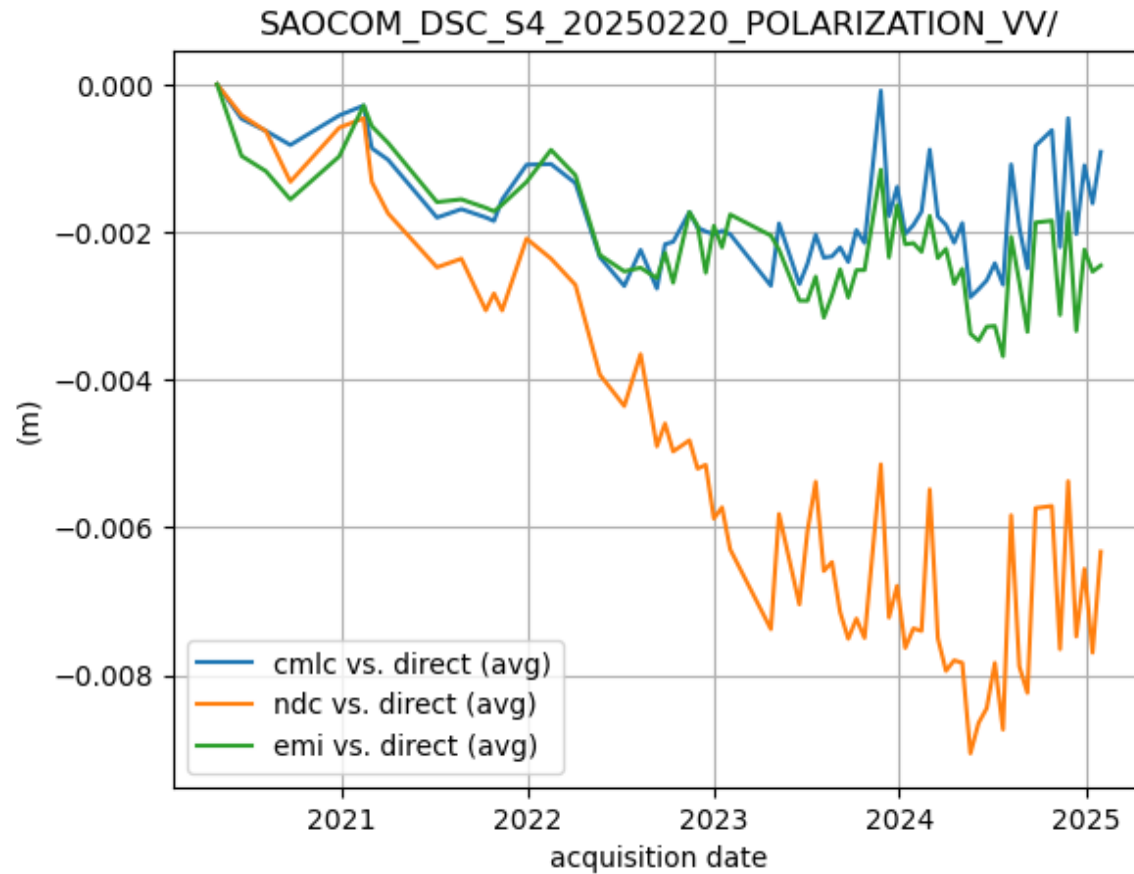
QGIS band math!

16-day interferogram
2025-01-14 / 2025-01-30

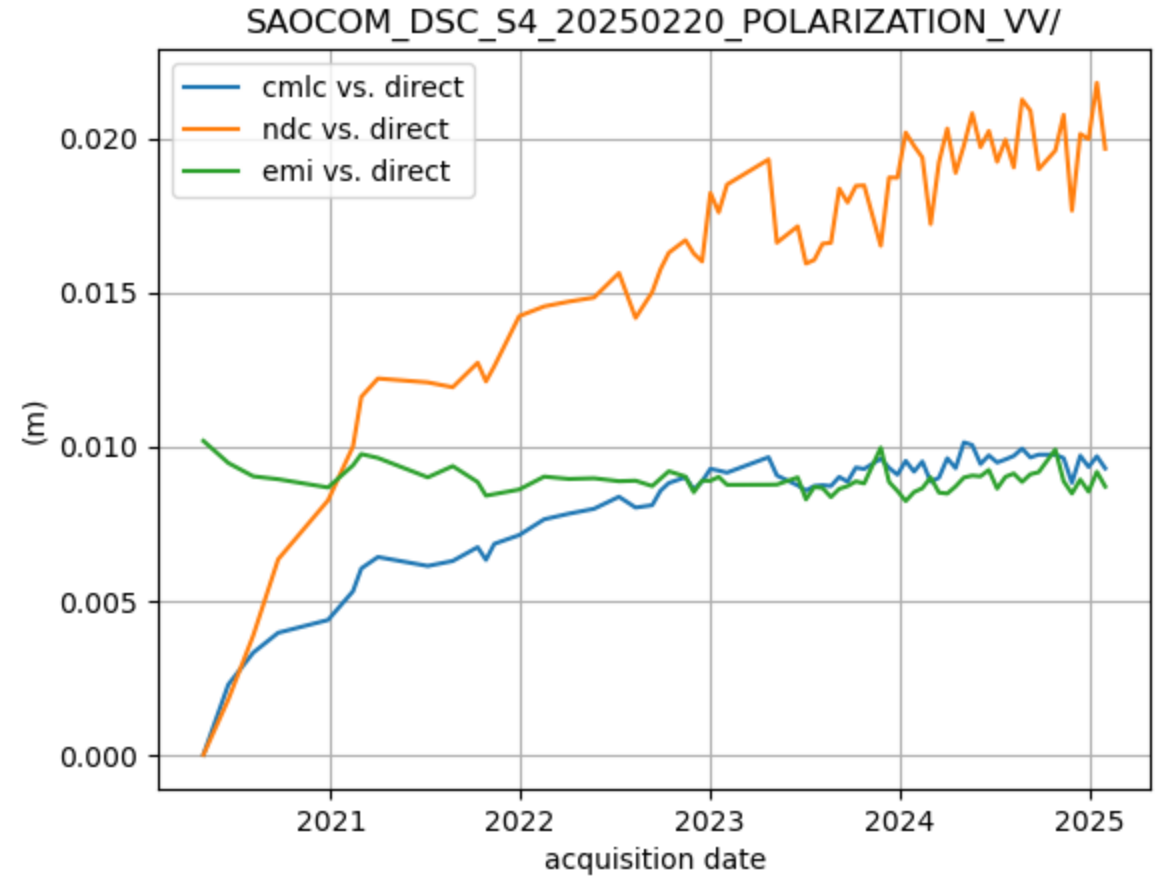


GMLP Quality Analysis

Average



Standard Deviation



Conclusions

Simplify processing maintaining rigorous information quality:

- CSLC: Full-resolution products in radar geometry to enable flexible processing workflows
- GMLP: innovative ARD inheriting all CSLC corrections while simplifying interferometric processing for both single interferometric pairs and full time series

Efficient exploitation of multiple SAR missions (Sentinel-1, ROSE-L, ...)

Prototype processors for the generation of Analysis Ready Data (ARD):

- Leveraging cloud-native technologies
- Open-source

Scientific validation of the products

Q&A

- Are you interested in these products?
- Suggestions for improvements

Thank you
a.morea@bopen.eu

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