

# Optical processing for quantifying Earth surface deformation: the ALADIM, MPIC and DSM-OPT on-demand services

ForM@Ter-MDIS Workshop – Strasbourg and La Petite-Pierre, October 14-18, 2019

#### A. Déprez, F. Provost, D. Michéa, J-.P. Malet

depreza@unistra.fr, floriane.provost@esa.int, michea@unistra.fr, jeanphilippe.malet@unistra.fr





Université de Strasbourg

TERRADUE

DSM-

# **ESA Thematic Exploitation Plateforms**

#### **Thematic Exploitation Platforms - TEPs**

- TEPs are an ESA originated R&D activity on the EO ground segment to demonstrate the benefit of new technologies for large scale processing of EO data
- TEPs are technology R&D, but still fully user driven

#### > New concept:



#### Data and tools are transferred to the user.

*Transferred many times, replicated in many places, and with data exploitation taking place at users' premises.* 



TERRA)UE





Users access a platform work environment providing the data, tools, and resources.

The user is involved in its governance and invited (and enabled) to share and collaborate.

## **The GeoHazards Exploitation Platform**



As part of the Thematic Exploitation Platform initiative, ESA is developing the GEP to bring the **user closer to the data** with a focus on new services and products

→ focus on large scale geohazard mapping and monitoring

Terra)ue

Advancing Earth Science

Université de Strasbourg



## **Geohazards Exploitation Plateform**



#### How to get access to the Geohazard Exploitation Platform – GEP ?

#### ESA Network of Ressources (NoR)

Single access point for **Resource tier** providers (ICT Providers hosting collocated EO data) and **Platform service** providers (built on top of a resource tier provider) for

- **Self-funded user:** Any user world wide requiring for any reason Resource Tier or Platform Services (e.g. Science, Development, Pre-commercial and Commercial) who funds the consumption themselves;
- User sponsored: (Science, Development, Pre-commercial) by ESA and other entities via Announcement of Opportunity
- > Available before end of 2019 for Resource Tier and at the **beginning of 2020 for platform services.**
- > Application will be selected on the basis of scientific excellence and the practicability to realize the project in due time.
- > As pre-requisites,
  - Users should have a nationality or be appointed at universities from ESA Member States contributing to EOEP5.
  - *Exceptions can be made for valuable international cooperation activities.*
  - Users intent to **publish a paper / poster** acknowledging the 'sponsoring' that was provided by ESA or the external cost waiving entities, promoting both the 'Network of Resources' as well as the used resource/platform providers

Sponsoring application form already available via Open Science Earth Observation (OSEO) call: <u>https://eo4society.esa.int/2019/06/07/network-of-resources/</u>









geohazards

## **GEP – Processing services**



### **GEP** – Run a service





## **GeoHazards Exploitation Platform**



geohazards

## Multispectral (MS)/Optical data for Earth surface deformation

Increasing spatial and temporal resolution of MS/optical satellites

Becomes an opportunity for geohazard mapping, monitoring, and understanding



#### For instance ...

• Sentinel-2 MSI instrument alone acquires 800 GB/day (2 x 800 GB/day with S-2B)



• Pléiades + SPOT6/7 constellation provide tri-stereo at 0.7 - 1.5 m resolution (< 24h response time)





## **Multispectral/Optical data for Earth surface deformation**



Build "generic" and "versatile" services based on optical image correlation for geohazards



Surface slip from the Balochistan earthquake (2013) for Landsat 8 images

Surface motion of a landslide in the French Alps over two years

## **Measuring displacement with MS/optical data - limitations**





## **MS/Optical services on the Geohazards Exploitation Platform**



## **Practical: MDIS Thematic App**

#### Connect on: https://geohazards-tep.eu



# **Practical: MDIS Thematic App**

geohazards	jp	malet 🔽 🗐 🕩	CEOS GEO
Home <u>Workspace</u> Ear Services Catalogue EO see Thematic Application	y Adopters Programme Background Observation tor Collaboration	ns & Measurements 👻	
Filter Apps 6 total results found.	λ		
	MDIS 2019 Training		



#### Motivation: building landslide inventories from space

Earthquakes and extreme rainfall (typhoons) can cause >1000s to 100,000s landslides.

Landslide inventories are key elements for all phases of DRM cycle

EO data is a useful source of information ... but there is a lack of fast and standard procedures to produce accurate and operational inventories









Williams et al. (2017): Landslide inventory map post-Gorkha earthquake

## **Detecting and mapping landslides** Motivation: building landslide inventories from space

Many landslides triggered on 15 March 2019 in Mozambique by Tropical Cyclone Idai

Sentinel 2 imagery gives the opportunity to rapiddly and efficiently detect and map landslides in very short time

**ALADIM**: an automated and generic IAbased change detection algorithm tailored for multispectral images







#### ALADIM service: Automatic landslide detection and inventory mapping

Image sources: MRO (S2) + VHRO (ortho-images)

**Approach:** Supervised change detection method - Selection of image features – Machine Learning

**Computation:** HPC + cloudbased implementation (dockerisation)

Université



ALADIM

#### ALADIM service: Automatic landslide detection and inventory mapping

#### Region of Interest and digitalization of a few training sample

See note: https://terradue.github.io/doc-tep-geohazards/tutorials/aladim\_input\_dataset\_preparation.html





#### ALADIM service: Automatic landslide detection and inventory mapping

Segmentation: parallell implementation of a region-merging algorithm



Segmentation on tiles yields different Segments (red)











ALADIM







Tile-based segmentation with margins and graph-based merging





#### ALADIM service: Automatic landslide detection and inventory mapping



	ALADIM
Number	
1	

Name	Derived from	Number
Area	Polygons	1
Flow accumulation (mean, variance)	DEM	2
Distance to drainage (mean, variance)	DEM	2
Distance to crest (mean, variance)	DEM	2
Flow direction (mean, variance)	DEM	1
Slope (mean, variance)	DEM	2
Topographic wetness index (mean, variance)	DEM	2
Fraction of stream pixels (mean, variance)	DEM	2
NDVI (mean, variance, change)	NDVI, pre-and post-images	6
Band values (mean, variance)	10 bands, pre-and post-images	40
Reflectance (mean, variance, change)	Average reflectance visible bands, pre-and post-images	6
Circularity	Polygons	1
Circularity (Haralick)	Polygons	1
Convexity	Polygons	1
Eccentricity (bounding box)	Polygons	1
Eccentricity (eigen vectors)	Polygons	1
Elongation	Polygons	1
Rectangularity	Polygons	1
Solidity	Polygons	1
GLCM contrast (topo-guided)	DEM, panchromatic	2
GLCM correlation (topo-guided)	DEM, panchromatic	2
GLCM entropy (topo-guided)	DEM, panchromatic	2
GLCM mean	panchromatic	1
TOTAL		83

#### ALADIM service: Automatic landslide detection and inventory mapping



#### Principle

- Build a large amount of decision trees (>500) from a training set.
- Each tree is built from a sub-sample of the training set (2/3 of the training set).
- Each node is built by testing radomly < Vn attributes (n=total number of attributes).
- Different thresholds are tested for the attributes.
- A node is built for the attributes that maximizes a gain function (e.g. Gini coeff.) between two classes.
- When a node is pure (contain only one classe) the tree stops.

#### Advantages

- Fast.
- Proven to be the most accurate method for a wide range of applications.
- Allow the use of a large number of attributes.
- Minimize over-fiting.
- Handle non-linear data.
- Unbiased estimation of the accuracy: Out Of Bag uses 1/3 of the training set to test the model.
- Estimate the attribute importance.
- Allow unsupervised classification and outlier detection.





24



## **Detecting and mapping landslides** ALADIM service: Step by Step

#### **1.** Creation of a landslide initial training sample



#### 2. Selection of input data





# TERRADUE

#### 3. Setting of the parameters

- Segmentation scale factor,
- Usage of cloud mask,
- Grid code,
- Sun elevation & azimuth ...

#### 4. Launching the job





Application for Mozambique Cyclone Idai - March 2019 - S2 data



Université



Application for Mozambique Cyclone Idai - March 2019 - S2 data





TERRA)UE

Advancing Earth Science



Application for Mozambique Cyclone Idai - March 2019 - S2 data





TERRA)UE

Advancing Earth Science



## **Detecting and mapping landslides** Use of landslide inventory maps

Computation of indicators / statistics

- Landslide number,
- Landslide surface,
- Landslide density maps,...

# Overlay of the landslide inventory maps with:

- Exposure maps,
- Population density maps, ...
- Correlation with triggers (rainfall, ETQ  $M_W$ )











• 0-100





**Other application – ALADIM-VHR: Haiti landslide inventory** 







**Other application – ALADIM-VHR: Haiti landslide inventory** 







**Other application – ALADIM-VHR: Haiti landslide inventory** 





33



Surface motion monitoring for geohazards

#### **Risk management and risk**





#### Better understanding of the mechanisms controlling the phenomena



# Modelling of the phenomena





Advancing Earth Science

Université de Strasbourg



#### Surface motion monitoring instruments and techniques

Methods	Measure	Instrument
GNSS	3D displacement at 1 point	Ground-based
Tacheometer	LOS motion at 1 point	Ground-based
Levelling	Z motion at 1 point	Ground-based
Lidar	3D reconstruction	Ground-based, airborne
Photogrametry	3D reconstruction	Ground-based, airborne, space borne
InSAR	LOS motion over a large area	Ground-based, airborne, space borne
Image Correlation	2D motion in the plane perpendicular to LOS	Ground-based, airborne, space borne

The 3 last methods are ground-based or space-borne allowing a large range of spatial resolution and revisit frequency







#### Image correlation – sub-pixel offset or feature tracking

- Measure internal misalignment using a moving template window, while measuring displacements that occurred in the time span between two acquisitions.
- Measure the displacement in the plan perpendicular to the camera LOS (ie. in case of nadir looking space borne, measure of horizontal motion).
- Different approaches have been implemented: Normalized Cross-Correlation Correlation in the frequency domain, etc.
- Different algorithms are available: CosiCorr (Caltech), MicMac (IGN), AMES (NASA), GeoFolki (ONERA), MathWorks-normxcorr2, DPIV, , etc.



TERRADUE



Image correlation – sub-pixel offset or feature tracking – advantages/limitations



- Monitoring of large movement (metric). Smaller movement can also be measured depending on satellite pixel size.
- Sensitive to cloud cover.



#### Space borne InSAR

- Sensitve to motion in the LOS i.e. sensitive to EW and vertical motion. Poorly sensitive to NS motion.
- > Millimetric accuracy.
- Monitoring of very small (mm) to cm motion. In cas of larger motion, decorelation usually prevents to monitor the deformation.
- > Non sensitive to cloud cover.





This two techniques are complementary to retrieve the complete 3D displacement for different magnitude of deformation



#### **Description of the MPIC processing chain**

- > MPIC stands for **Multiple-Pairwise Image Correlation**.
- > The MPIC service comprises two main steps:
  - 1. The MPIC itself,

2. A multi-temporal fusion that compute different features of the displacement time series in order to detect **persistent motion pattern**.

Inputs:Several optical acquisitions – Sentinel 2Outputs:Correlation coefficient for each pair of images

Cloud masks EW and NS displacement for each pair of images

- Mean absolute velocity EW and NS
- Mean displacement magnitude in meters





TERRAJUE





Stumpf et al. (2016)

#### **Quantifying tectonic deformation and monitoring** landslide motion • Effect of increasing spatial regularization strength

#### **Parameterization**

• Effect of image correlation algorithms and parameterization





**MPIC** 

#### Description of the MPIC processing chain

#### ➢ MPIC

**MicMac**, developed by IGN, is used to compute the NCC and the sub-pixel displacement.

MicMac was chosen among other algorithm because of its regularization method, it produces smoother results with less noise and smaller windows size.

#### Multi-temporal fusion



Mean displacement Account for persistent of the movement in space and time.





Vector Coherence Account for coherence of the direction and magnitude of the motion in space and time.



Multiple-pairwise image correlation (MPIC)



Stumpf et al. (2016)

# MPIC

#### **MPIC** – algorithm details

#### 1. Cloud mask

Computed with python function *Fmask* (Zhu, Z. and Woodcock, C.E., 2015) for each Sentinel-2 acquisition, then combined.

#### 2. Correlation

Computed with **MicMac** for all pairs.

#### 3. Deramping

Correct systematic offset resulting mainly from translation and rotation.

$$\Delta x_{a,i} = a_x + b_x x_{r,i} + c_x y_{r,i}$$
  
$$\Delta y_{a,i} = |a_y + b_y x_{r,i} + c_y y_{r,i}$$
  
Modelling of the ramp

#### 4. De-striping

Correct small systematic image offsets which manifest as along-track striping artefacts which are particularly visible in the EW component but can also be observed in the NS component (for Sentinel-2). This is due to staggered sensor arrays of push broom satellite such as Sentinel-2.



TERRADUE



Stumpf et al., 2018





#### **Description of the MPIC parameters on GEP**

images.



Matches with a correlation coefficient below this threshold will be discarded.

Defines the search range in pixel for finding matches. The actual search range is computed from this parameter as round(Spatial matching range/0.8)+2.

Default value: 3 (i.e. 7x7pixel window size).

Controls the smoothness of the expected motion field. Increasing the regularization parameter is putting greater emphasis on a smooth motion field where neighbouring pixels will have similar displacement values.

	Job title *	cal ima		5/
	Sentinel-2 products (at least 2) *			
	➤ https://catalog.terradue.com//ser	n <mark>t</mark> inel2/	'search?uid= ⊕	
	Sentinel-2 band *			
	B04 ~			
	Temporal matching range *			
	<b>7</b> - 2	_		
	Sentinel-2 tile *			
	<b>₽</b> - 59GQP		A smaller window will allow	to
	Split date (yyyy-MM-ddTHH) *		better reconstruct small sca variations while at the same	ile e time
	7 -		can lead to more noise. Vice	e versa
	Activate backward matching *		greater robustness against i	noise
	True ~		while smoothing small scale	details.
	Window size *		2	
	<b>7</b> - 3	Tł	nis parameter should be	
Y	Decorrelation threshold *	ac m	djusted according to the aximum expected displaceme	ont
$\langle  $	₽ - 0.2	ta	king into account also the	
	Spatial matching range *	pc in	ossible coregistration bias of t put images.	he
	<b>7 -</b> 1			
$\backslash$	Regularization parameter *			

**MPIC** 

#### MPIC for tectonic deformation – Comparison to other results

Mw 7.5 Sulawesi Earthquake - Sep 29, 2018



JOBS: MPIC-OPT-Palu2018 - 50MRD MPIC-OPT-Palu2018 - 50MRE Inputs: 2 images, 2018/09/17 - 2018/10/02







#### Along track displacement (m)

**MPIC** 





# **Quantifying tectonic deformation and monitoring**



MPIC for tectonic deformation – Influence of Regularization and windows size parameters

Ridgecrest earthquake sequence - July, 2019



JOBS: MPIC-OPT S2B Ridgecrest EQ 20190628-20190708 MPIC-OPT - Ridgecrest EQ 2019 – reg0.8 MPIC-OPT - Ridgecrest EQ 2019 - win7

Inputs: 2 images, 2019/06/28 - 2019/07/08







Ridgecrest earthquake sequence - July, 2019



JOBS: MPIC-OPT S2B Ridgecrest EQ 20190628-20190708 MPIC-OPT - Ridgecrest EQ 2019 – reg0.8 MPIC-OPT - Ridgecrest EQ 2019 - win7

Inputs: 2 images, 2019/06/28 – 2019/07/08 Window size = 3 Regularization parameter = 0.8





**Mean displacement** Account for persistent of the movement in <u>space</u> and time.



Regularization = 0.7

**Effect of the regularization parameter** > Mw 7.2 Halmahera Earthquake, July 14, 2019 Q **Regularization = 0.3 (default)** ₿× ₿ **JOBS:** MPIC-OPT - Halmahera earthquake 2019 ₩ х MPIC-OPT - Halmahera earthquake 2019 - reg0.7 Inputs: 2 images, 2018/11/12 - 2019/08/09

Mean EW velocity (m/days)



Advancing Earth Science

**Monitoring landslide motion – pre-rupture signal** 

Fagraskógarfjall landslide , Iceland



Rupture : 7th July 2018, 05:17am Volume ~ 10 millions m<sup>3</sup> of debris





**Monitoring landslide motion – pre-rupture signal** 

Fagraskógarfjall landslide , Iceland







**Monitoring landslide motion – pre-rupture signal** > Fagraskógarfjall landslide , Iceland

Full Resolution Rasterization - Fagraskógarfjall 2018 landslide

Inputs: 2 images, 2018/06/20 - 2018/08/09



Monitoring landslide motion – pre-rupture signal

Fagraskógarfjall landslide , Iceland

de Strasbourg

#### JOB:

MPIC-OPT - Fagraskógarfjall 2018 landslide

Inputs: 2 images, 2017/05/21 – 2018/06/20





#### **Quantifying tectonic deformation and monitoring** landslide motion JOB: MPIC-OPT - Fagraskógarfjall 2018 landslide

**Monitoring landslide motion – pre-rupture signal** > Fagraskógarfjall landslide , Iceland

**Inputs:** 2 images, 2017/05/21 – 2018/06/20



Mean displacement magnitude (m)



NS (upper left) and EW (lower left) mean velocity (m/day)



Monitoring glacier motion − → Mer de glace, French Alps, France







# Quantifying tectonic deformation and monitoring landslide motion See the cloud masks quality.



Monitoring glacier motion − → Mer de glace, French Alps, France

JOBS: MPIC-OPT – Chamonix2016-2018 Full Resolution Rasterization - Chamonix2016-2018

Inputs: 3 images, 2016/08/13, 2017/10/07, 2018/08/28







Monitoring glacier motion − → Miage glacier , French Alps, France







#### Monitoring glacier motion − → Miage glacier , French Alps, France

JOBS: MPIC-OPT – Chamonix2016-2018 Full Resolution Rasterization - Chamonix2016-2018

Inputs: 3 images, 2016/08/13, 2017/10/07, 2018/08/28 Mean displacement magnitude (m)

# Pree text search







DSM-OPT service on-line on GEP: creation of High-Resolution Digital Surface Models (HR-DSMs) and orthophotos from Pléiades stereo-images





de Strasbourg



Tutorial: https://terradue.github.io/doc-tep-geohazards/tutorials/dsm-opt.html







Stumpf et al. (2019)



#### • Bundle adjustment with Rational Polynomial Functions (RPC)



 Bias terms are added to the model and estimated based on tie points and ground control points

1	$F_1(U,V,W)$
$I + A_0 + A_1 I + A_2 s =$	$F_2(U,V,W)$
- D - D - D - D	$F_3(U,V,W)$
$s + B_0 + B_1 I + B_2 s =$	$\overline{F_4(U,V,W)}$







204.5 207.1 209.7 212.3









Ortho-image of a HR-DSM (0.5m) over the city of Strasbourg / Pléiades stereo of Sept. 2016

TERRADUE



Application: morpho-structures mapping





Hillshade of a HR-DSM (0.5m) over Norcia / N. Apennines ETQ. -2016 / Pléiades stereo of Sept. 2016



#### Application: sediment budget analysis



Pléiades image of Soufriere Hills Volcano, 2017. (purple shows Belham Valley catchment)

Significant deposition of volcanic lastic material in the Belham River Valley between 1995–2010  $\,$ 

Channel prone to hazardous rain-triggered lahars and associated geomorphic changes

Our new 2019 DSM will be compared with a LIDAR DSM made in 2010 to quantify erosion and deposition in different parts of the valley.



Hillshade of a HR-DSM (0.5m) over Soufriere Hills / Montserrat



James Christie & Georgina Bennett (Univ. East Anglia)



#### **Application:** sediment budget analysis

2010 1m LiDAR DSM (Montserrat Volcano Observatory)



Area shown in the example target areas below (green box)





Hillshade of a HR-DSM (0.5m) over Soufriere Hills / Montserrat



Qualitative observations:

- Channel widening and straightening (removal of pyroclastic terraces)
- Deep channel incision and increased sinuosity.



Application: lava flow volume quantification





Hillshade of a HR-DSM (0.5m) over Piton de la Fournaise / La Réunion



A key issue: managing sensor Licence and distribution of products

Airbus Defense & Space

May 2017

#### LICENCE TO USE PLEIADES PRODUCTS GRANTED AT A PREFERENTIAL PRICE BY CNES TO CATEGORY 1 INSTITUTIONAL USERS AND ASSIMILATED CATEGORY 1 INSTITUTIONAL USERS UNDER THE ISIS - PLEIADES PROGRAMME

Please read the terms and conditions of this User Licence Agreement carefully before placing any orders for Protected Products.

#### INTRODUCTION

In the framework of the public service delegation agreement concerning the operations of the Pleiades satellites concluded between CNES and Airbus DS (subsequently referred to as the "DSP"), Airbus DS has committed itself to distribute Pleiades products and services for the benefit of AUTHORISED INSTITUTIONAL USERS in order to fulfill their responsibilities in the frame of their institutional mission for NON-COMMERCIAL SERVICES.

CNES and Airbus DS have opened the ISIS programme to Pleiades products allowing eligible users (European scientific community) to obtain Pleiades images under special ISIS programme preferential pricing conditions, based on DSP Category 1 pricing.

Accomplishing any of the following acts implies acceptance by the USER of the terms of the present Licence Agreement (hereinafter "Licence":

Management of the Pléiades licence via GEP (for CEOS-related images)

# **On-going works and next steps ...**



As a GEP service: integrate the possibility of digitizing training samples on-line
 In terms of methods: integrate other VHRO sensors (Planets, Worldview, Deimos, etc) for further applicability develop a SAR (amplitude-based, coherence-based) change detection method integrate active learning sampling



As a GEP service: propose an earthquake-related service (4 images) and a landslide/glacier related service (times series)
 In terms of methods:

 integrate other VHRO sensors (Planets, Worldview, Deimos, etc) for further applicability
 integrate optical flow derived matching techniques to take into account more complex motion patterns
 integrate refined Sentinel-2 geometric correction for mountainous areas and detection of seasonal motion



In terms of methods:

integrate other VHRO sensors with stereo-photogrammetric acquisitions integrate DSM-related scenarios / parameterization and topography fusion





# geohazards

Aline Déprez - depreza@unistra.fr Floriane Provost - floriane.provost@esa.int David Michéa - michea@unistra.fr Jean-Philippe Malet - jeanphilippe.malet@unistra.fr

