

# Suivi des glaciers de montagne par imagerie radar satellitaire

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LISTIC – Université Savoie Mont Blanc

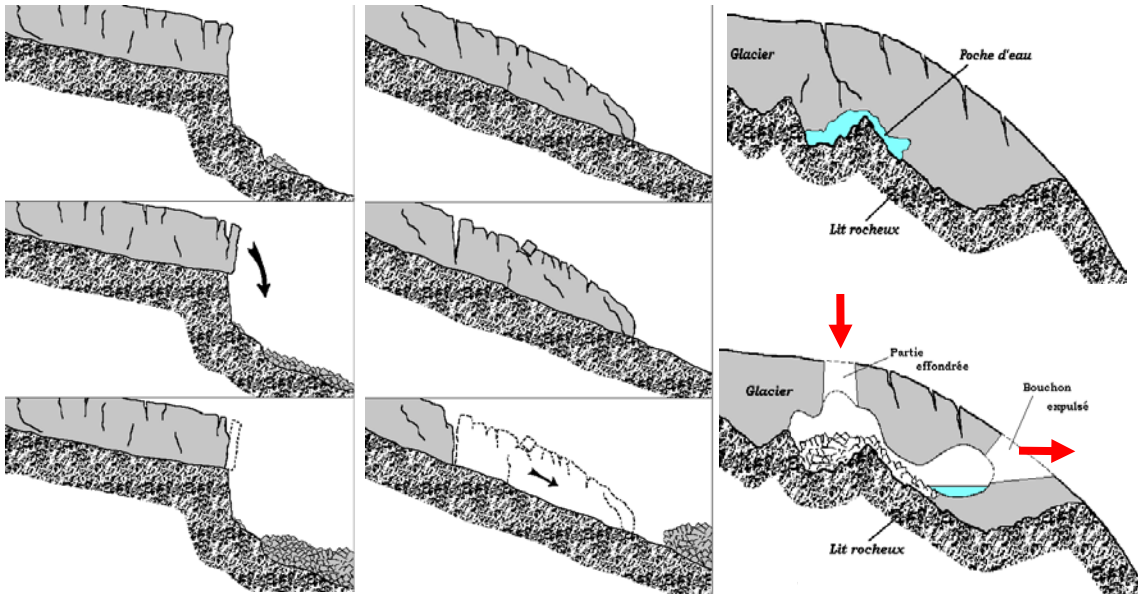
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With contributions from : J.-M. Nicolas (Télécom P.), M. Gay and G. Vasile (GIPSA), Y. Yan, R. Fallourd, A. Dehecq and M. Jauvin (LISTIC), and project partners from :

- MEGATOR (ACI MD 2004-2007) : <http://www.megator.fr>
- EFIDIR (ANR MDCO 2008-2012) : <http://efidir.poleterresolide.fr/>

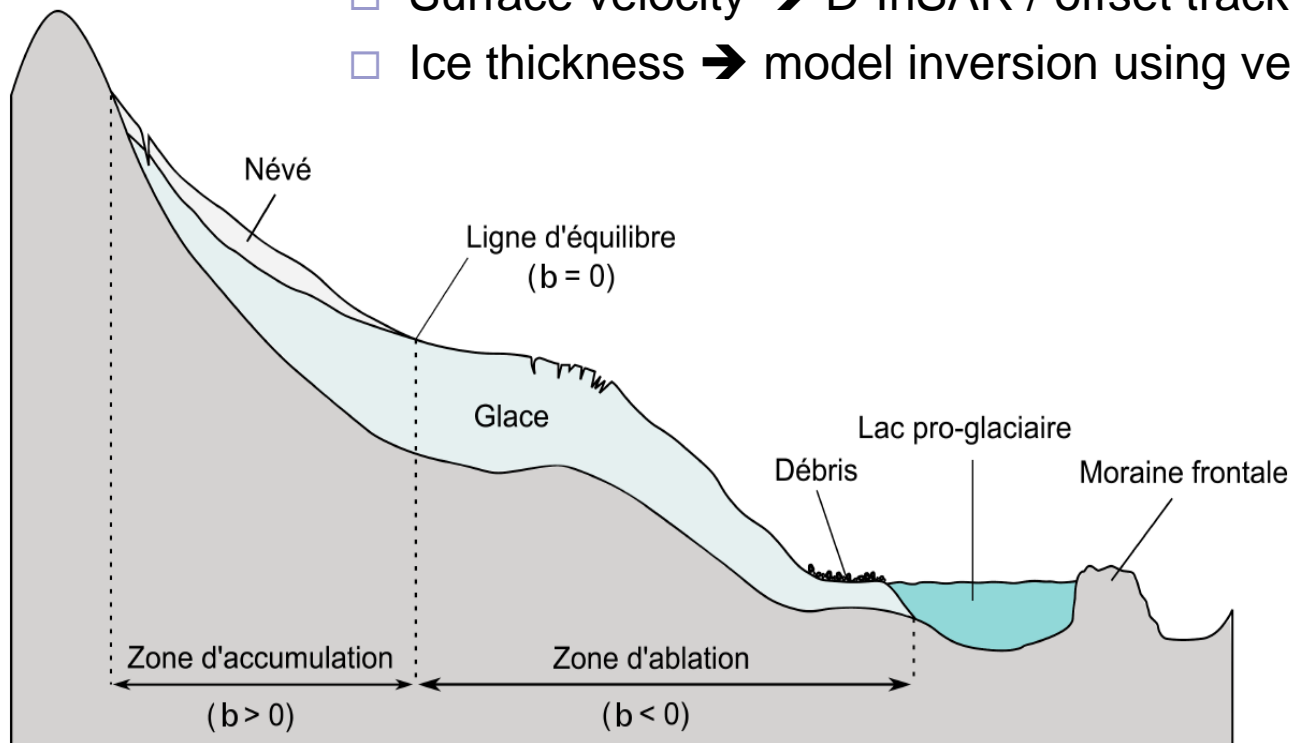
# Why monitoring temperate glaciers?

- **Economical issues**
  - water resources, tourism activity
- **Environmental issues**
  - local impact of global change
- **Risk assessment**
  - seracs, crevasses, water accumulation...



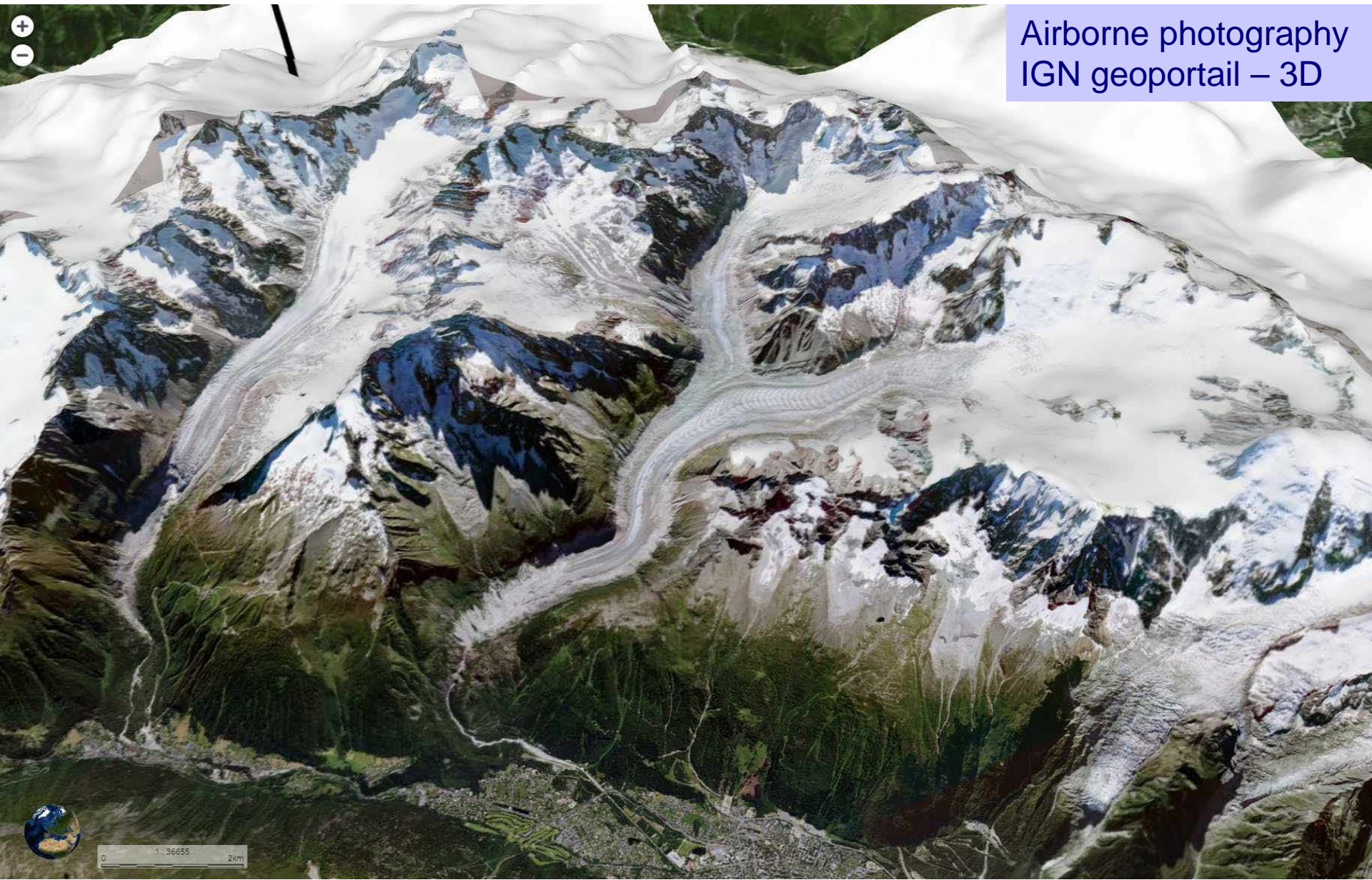
# SAR contribution for glaciology

- Physical parameters to observe
  - Front position → HR data segmentation / change detection
  - Surface state → PolSAR data
  - Elevation variations / mass balance → InSAR, TanDEM-X
  - Surface velocity → D-InSAR / offset tracking
  - Ice thickness → model inversion using velocity

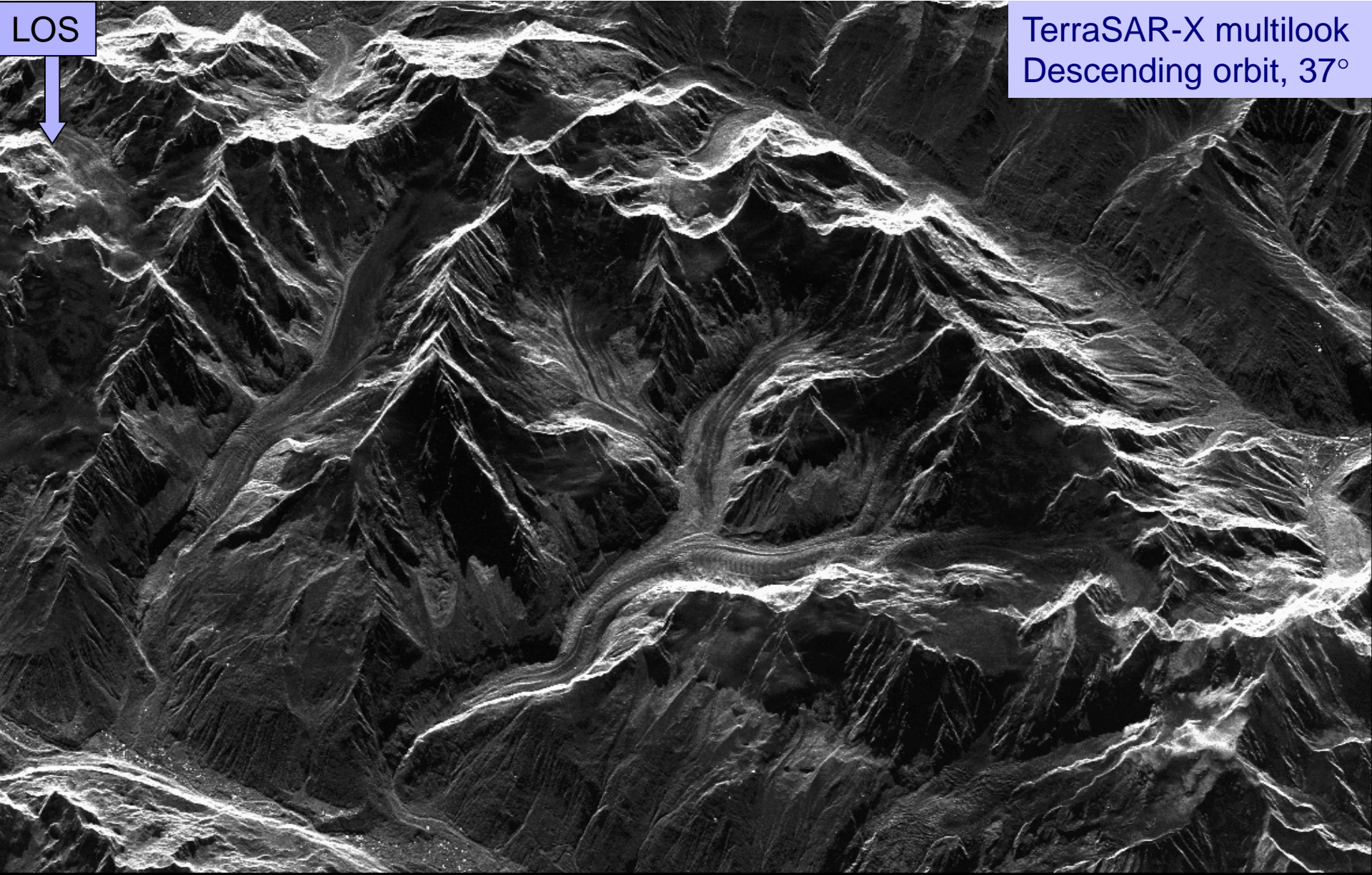


# Chamonix Mont-Blanc test-site

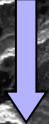
Airborne photography  
IGN geoportail – 3D



# Chamonix Mont-Blanc test-site

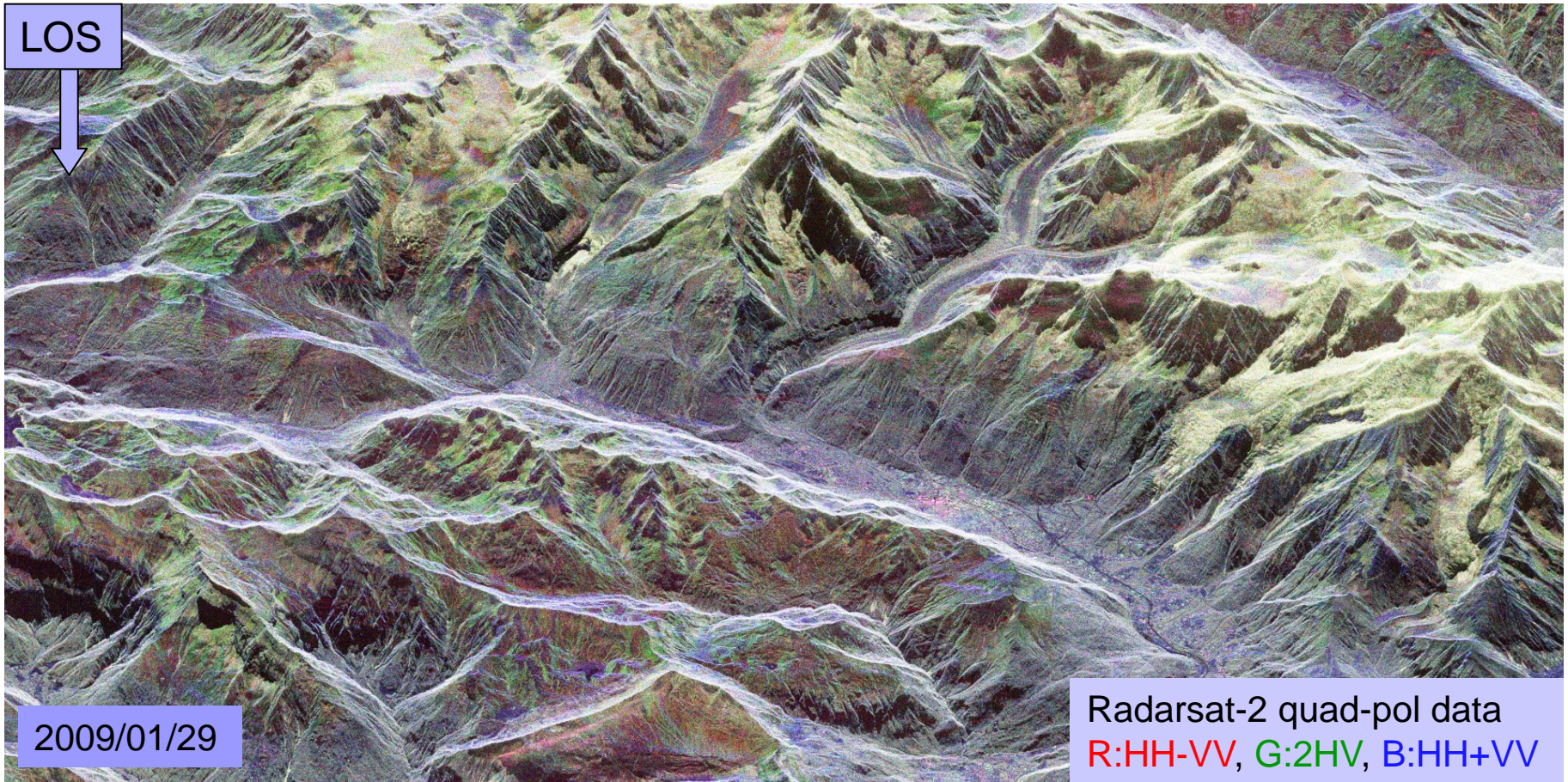


LOS

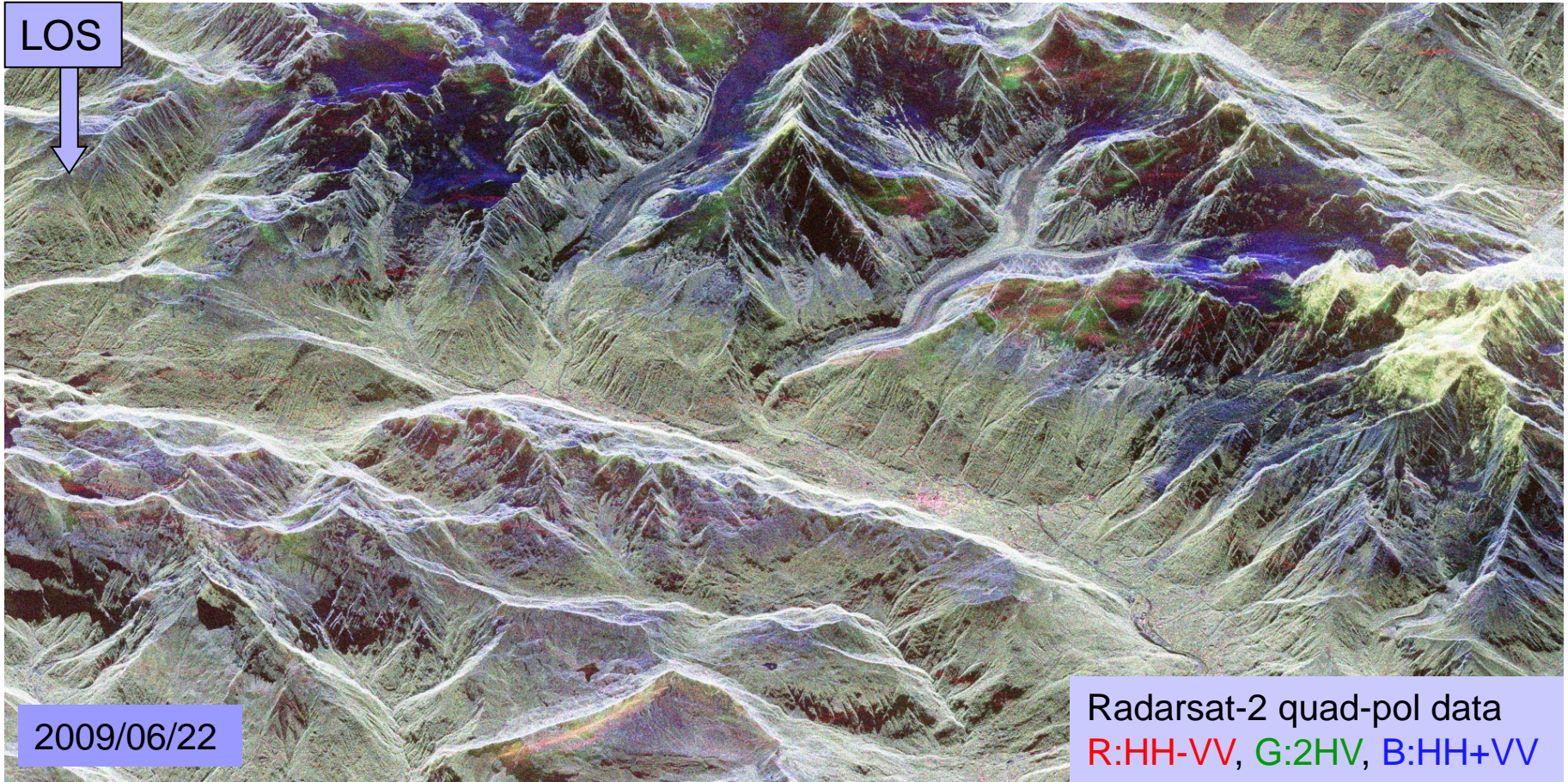


TerraSAR-X multilook  
Descending orbit, 37°

# Chamonix Mont-Blanc test-site



# Chamonix Mont-Blanc test-site



# 3 generations of SAR satellites

## ■ 90-2015 1<sup>st</sup> generation

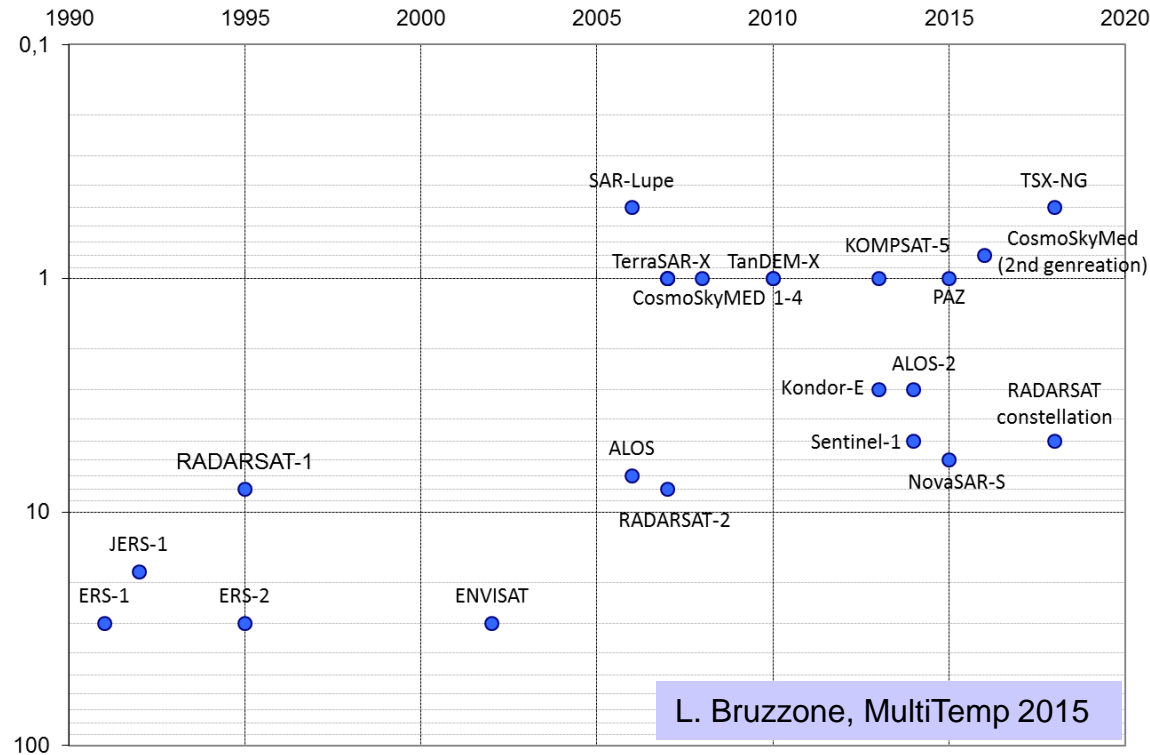
- ERS-1/2, ENVISAT: C band, ~20m, 35 days
- JERS: L band, 20m
- Radarsat-1: C band, ~10m

## ■ 2005-2014 2<sup>nd</sup> generation

- ALOS: L band, 10m, quad-pol, 46 days
- TerraSAR-X (DLR): X band, ~1m, dual-pol, 11 days
- Radarsat-2 (CSA): C band, ~3m, quad-pol, 24 days
- COSMO-SkyMed (ASI): X band, ~1m, 4 satellites => 4 days

## ■ 2015-2025 3<sup>rd</sup> generation

- Sentinel-1 A/B: C band, ~5x15m, dual-pol, 12->6 days, **systematic, FREE ACCESS**
- ...

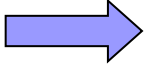


L. Bruzzone, MultiTemp 2015

- High Resolution  
- Polarimetry



# Overview

- 
1. Surface displacement by differential interferometry
    - Potential and limits
    - Processing steps
    - Results from ERS tandem data
  2. 2D/3D surface displacement by offset tracking
    - Potential and limits
    - Processing steps
    - Results from TerraSAR-X stripmap images
  3. Surface elevation by SAR interferometry
    - Potential and limits
    - Processing steps
    - Results from TanDEM-X data
  4. How about Sentinel-1?
  5. Perspectives

# Interferometric data

- 2 SLC images:

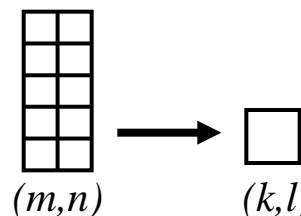
$$u_1(m, n) = \rho_1(m, n)e^{i\phi_1(m, n)}$$

$$u_2(m, n) = \rho_2(m, n)e^{i\phi_2(m, n)}$$

Registration, Hermitien product

$$u_1(m, n).u_2^*(m, n) = \rho_1(m, n).\rho_2(m, n).e^{i(\phi_1-\phi_2)}$$

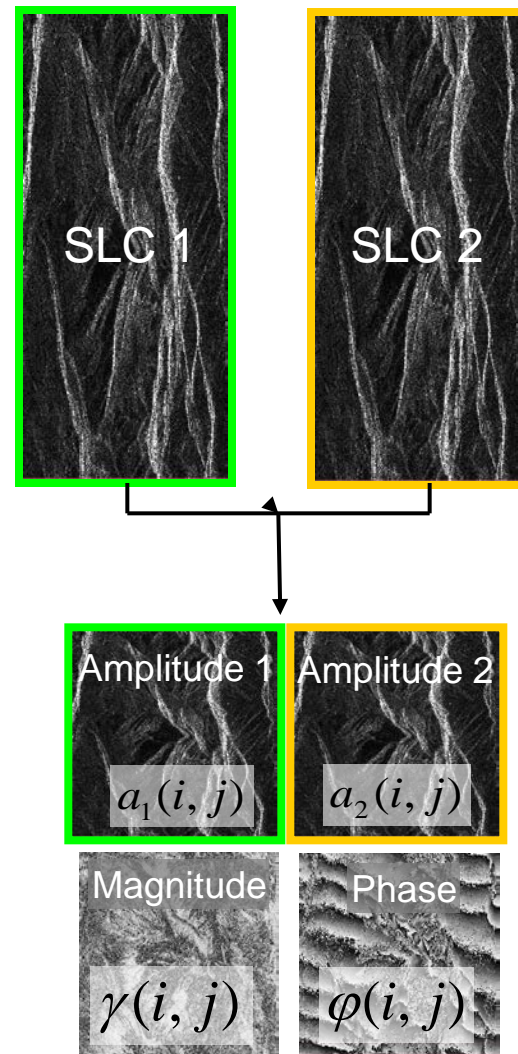
- Initial complex multi-looking



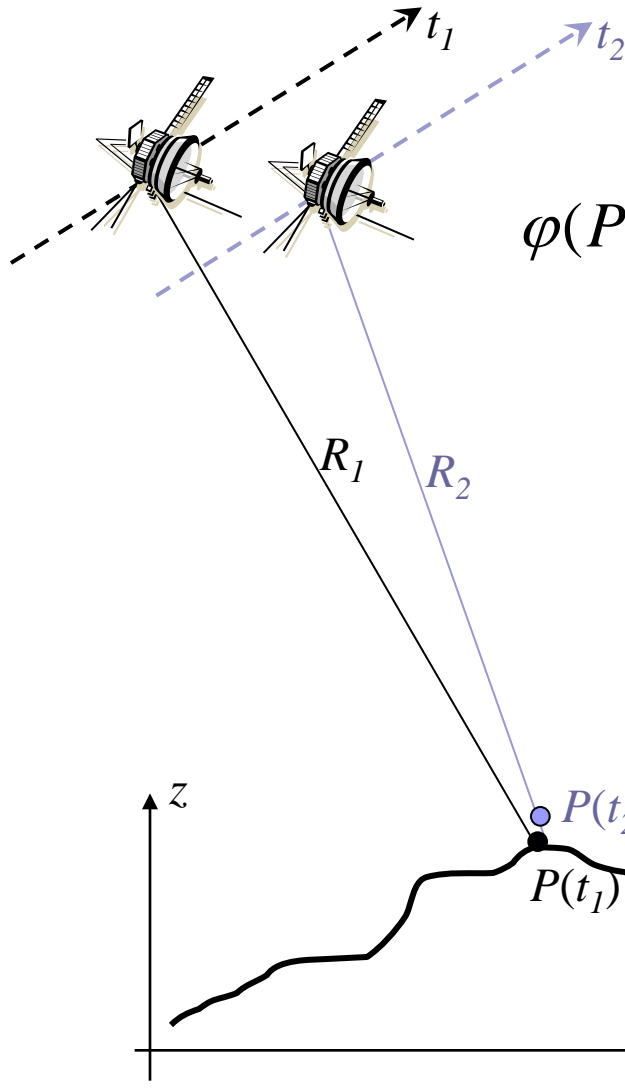
$$\gamma(k, l)e^{i\phi(k, l)} = \frac{\sum_{(m, n)} u_1(m, n).u_2^*(m, n)e^{-i\phi(m, n)_{known}}}{\sqrt{\sum_{(m, n)} |u_1(m, n)|^2 \cdot \sum_{(m, n)} |u_2(m, n)|^2}}$$

**COHERENCE**

**INTERFEROGRAM**



# Interferometric phase



$$\begin{aligned} \varphi(P) &= \phi_2(P(t_2)) - \phi_1(P(t_1)) = \frac{4\pi}{\lambda} (R_2 - R_1) + \dots \\ &= \phi_{geom.}(P(x, z)) \quad \rightarrow \text{Digital Elevation Model (DEM)} \\ &+ \phi_{displ.}(P(t_2) - P(t_1)) \quad \rightarrow \text{Displacement field} \\ &+ \varphi_{ground}(t_2) - \varphi_{ground}(t_1) \quad \rightarrow \text{Decorrelation} \\ &+ \phi_{atmo.}(t_2) - \phi_{atmo.}(t_1) \quad \rightarrow \text{Atmospheric perturbations} \end{aligned}$$

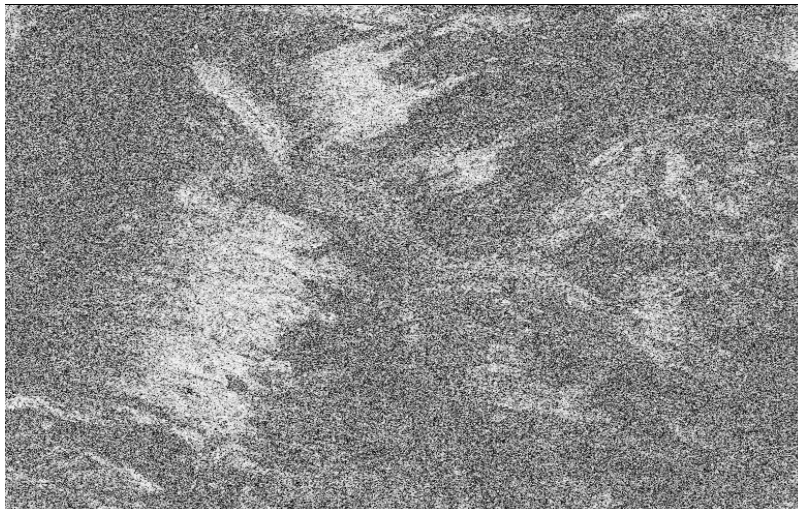
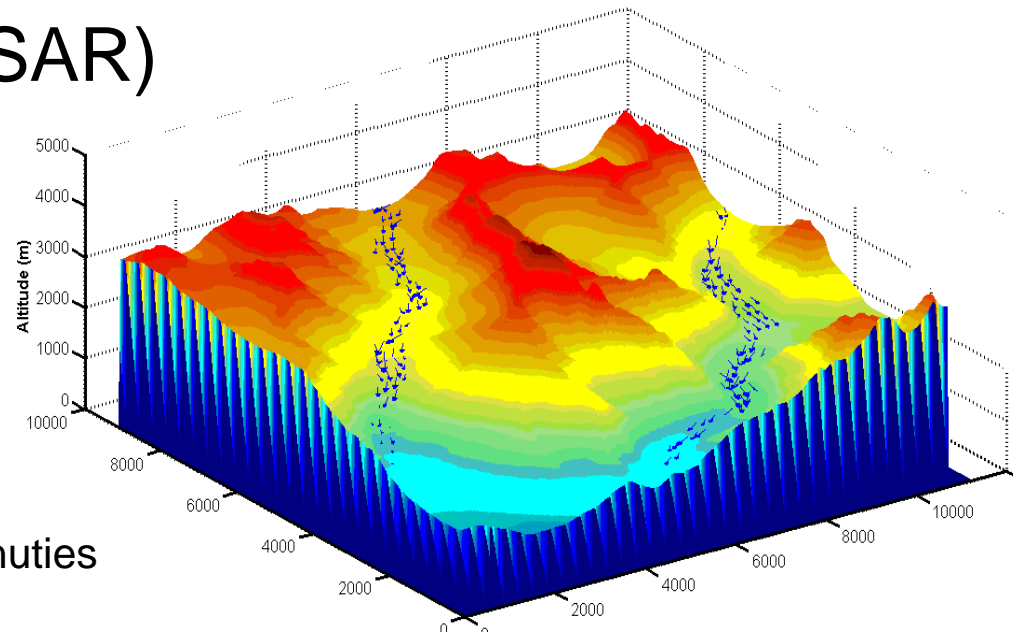
## Interferometric data (InSAR)

### ■ Potential

- InSAR: topography
- D-InSAR: displacement

### ■ Limits

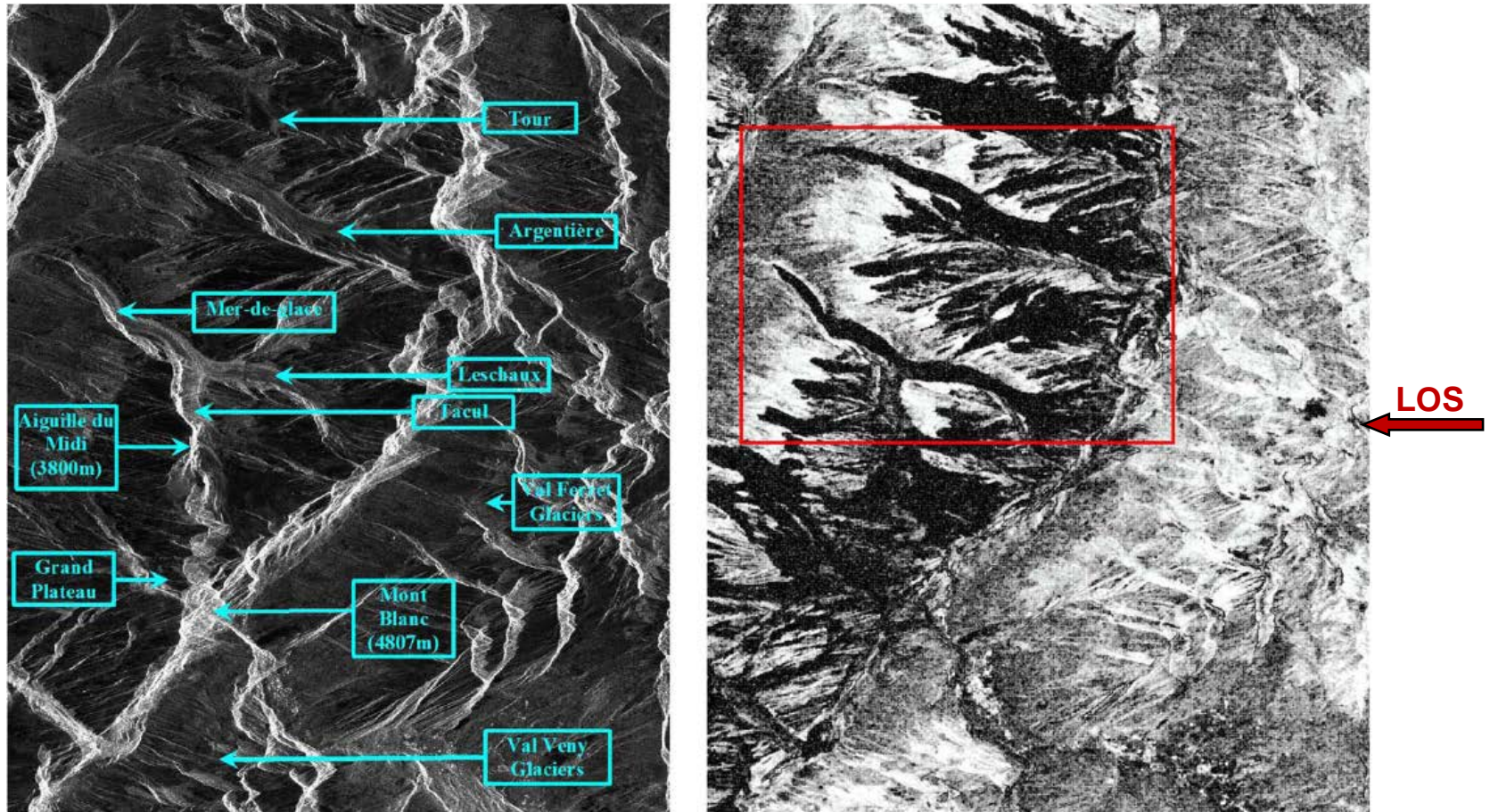
- Temporal/baseline decorrelation
- Aliasing
- Phase unwrapping: noise, discontinuities
- Atmospheric perturbations



**ERS 1/2, 95/12/31-96/01/01, Mont-Blanc area**

# Coherence limitation, ERS

- ERS data, C band, Res~20m



ERS-1, 3-day pair, summer 1991, Chamonix Mont-Blanc

# Noise and phase unwrapping limitation

Estimation of the 2D local frequency (phase gradient):  $(f_x, f_y)$

- Analytic signal

$$e^{i\phi} = e^{i\phi_d} e^{i\phi_n}$$

- 1<sup>st</sup> order model

$$\phi_d(m, n) = \phi_d(k, l) + 2\pi[(m - k) \cdot f_x + (n - l) \cdot f_y]$$

Application:

- Coherence and phase filtering
  - ➔ compensation of the local slope in the averaging window to respect the “local stationarity” hypothesis [Vasile-08]
- Phase unwrapping
  - ➔ integration of the phase gradient

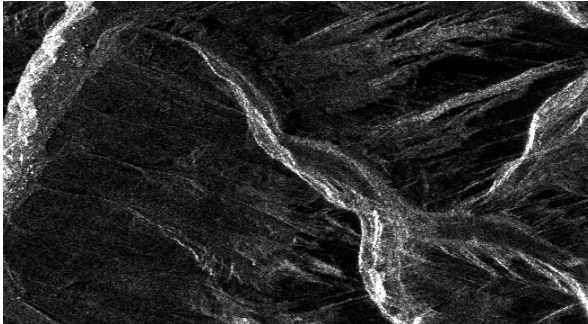
# Coherence and Phase filtering - results

amplitude

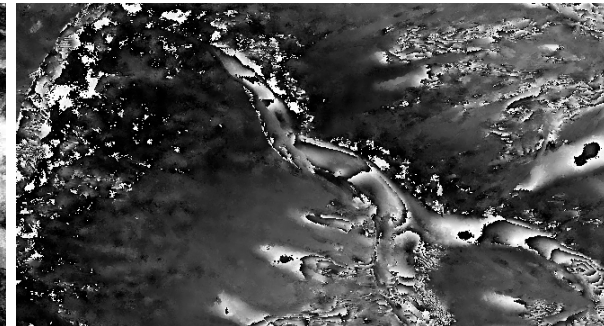
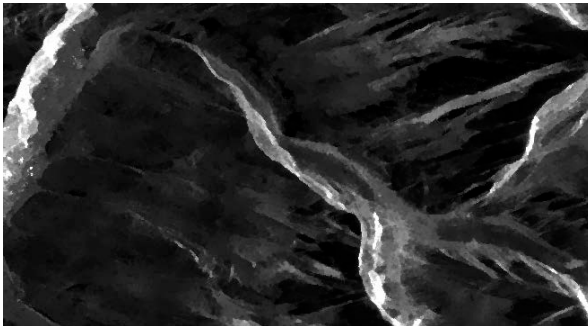
coherence

phase

Initial 5 looks

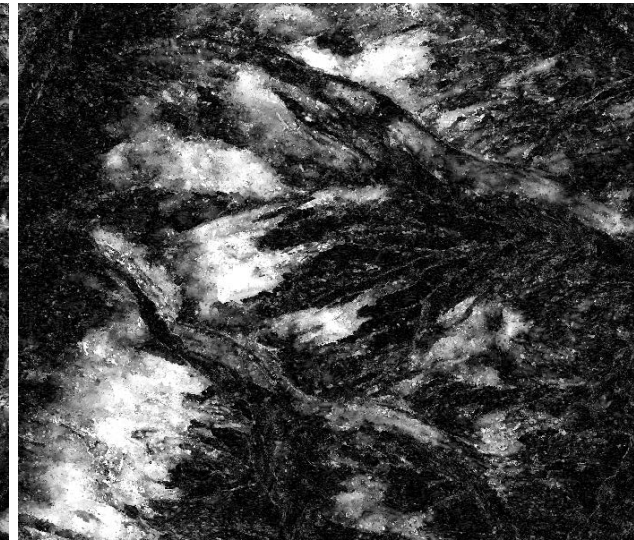
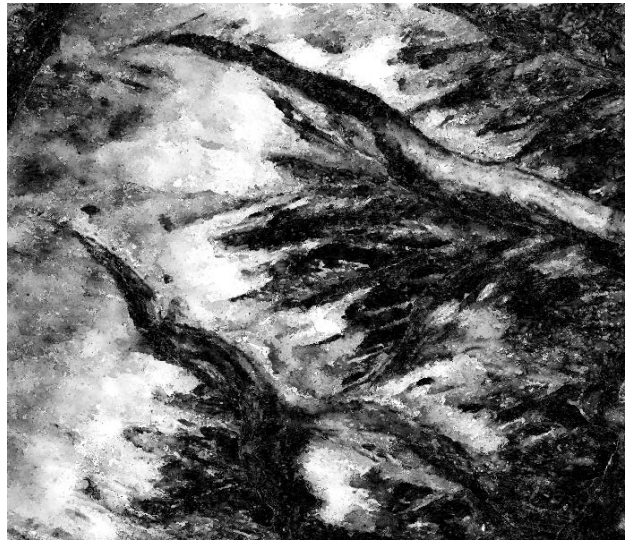


Filtered



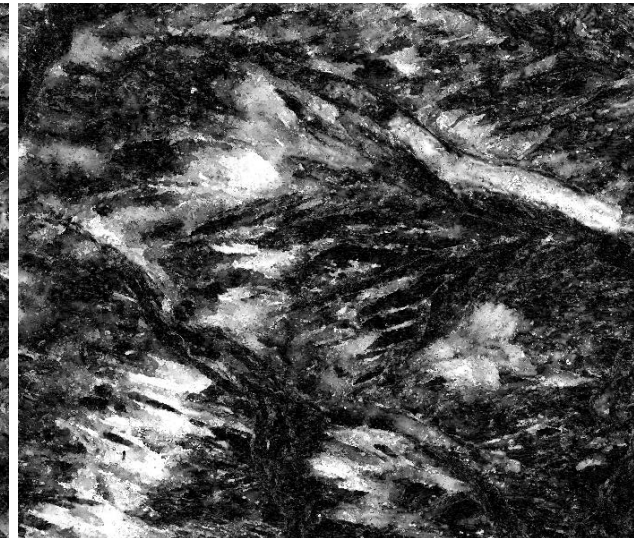
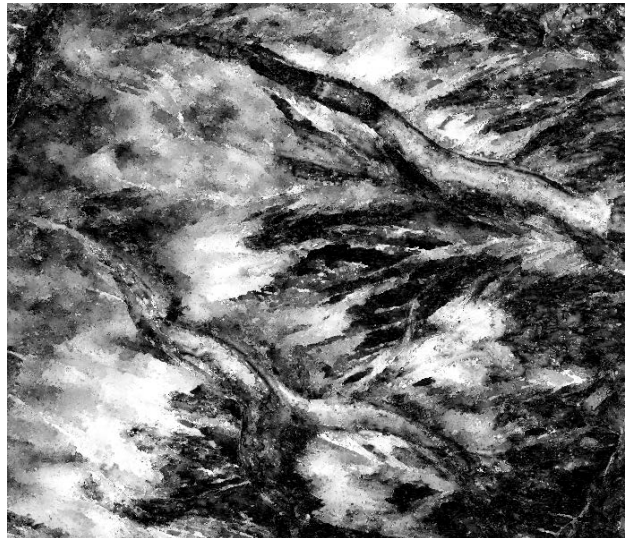
ERS, Mer-de-Glace glacier [660 × 360 pixels]

# ERS, D-InSAR over Alpine glaciers



LOS  
←

31 déc 95 /  
1 jan 96  
 $b^\perp = 208$  m



14 / 15 avr 96  
 $b^\perp = 93$  m

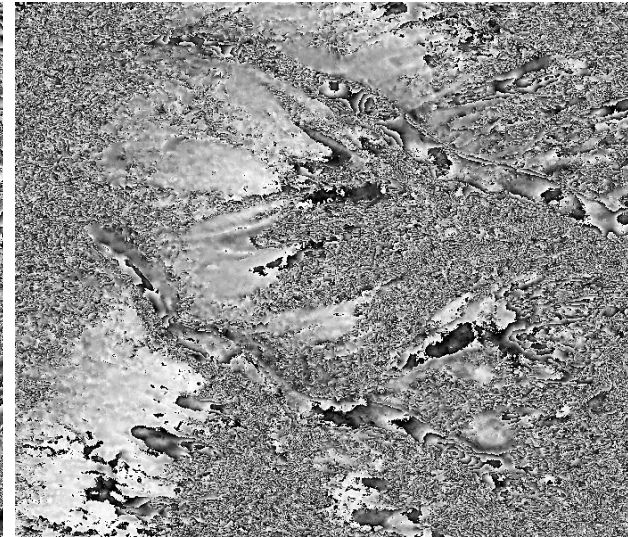
ERS-tandem, autumn/winter/spring 95-96, Chamonix Mont-Blanc

22 / 23 oct 95  
 $b^\perp = -107$  m

10 / 11 mar 96  
 $b^\perp = 9$  m

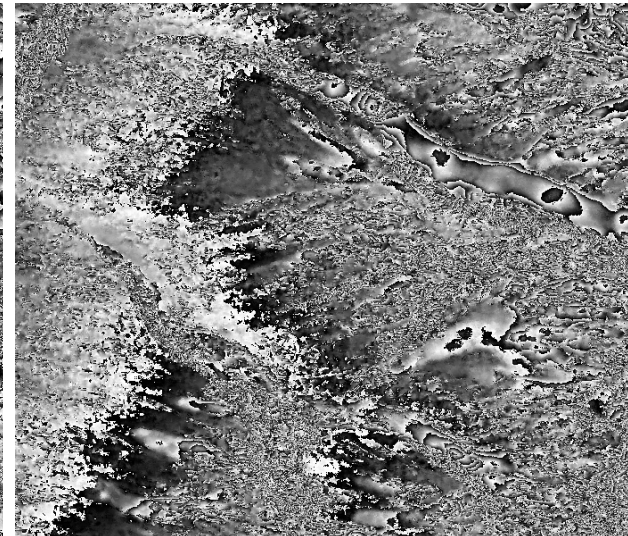


# ERS, D-InSAR over Alpine glaciers



LOS  
←

31 déc 95 /  
1 jan 96  
 $b^\perp = 208$  m



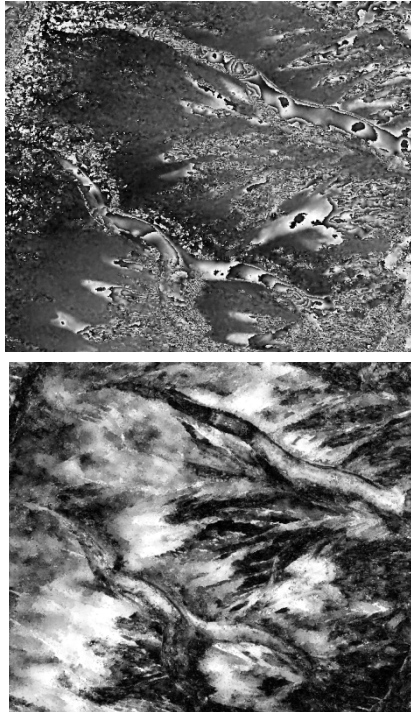
14 / 15 avr 96  
 $b^\perp = 93$  m

ERS-tandem, autumn/winter/spring 95-96, Chamonix Mont-Blanc

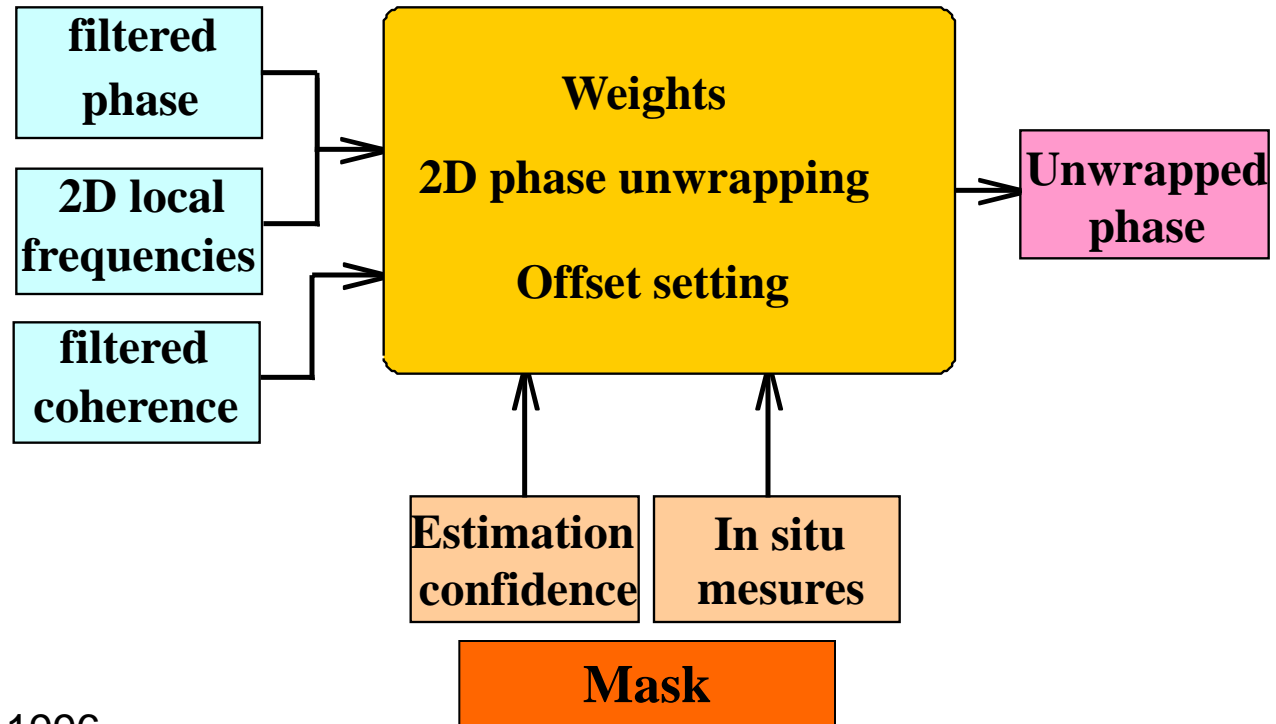
22 / 23 oct 95  
 $b^\perp = -107$  m

10 / 11 mar 96  
 $b^\perp = 9$  m

# Weighted Least Square Phase Unwrapping



TANDEM ERS, 10/11-March-1996  
Chamonix Mont-Blanc

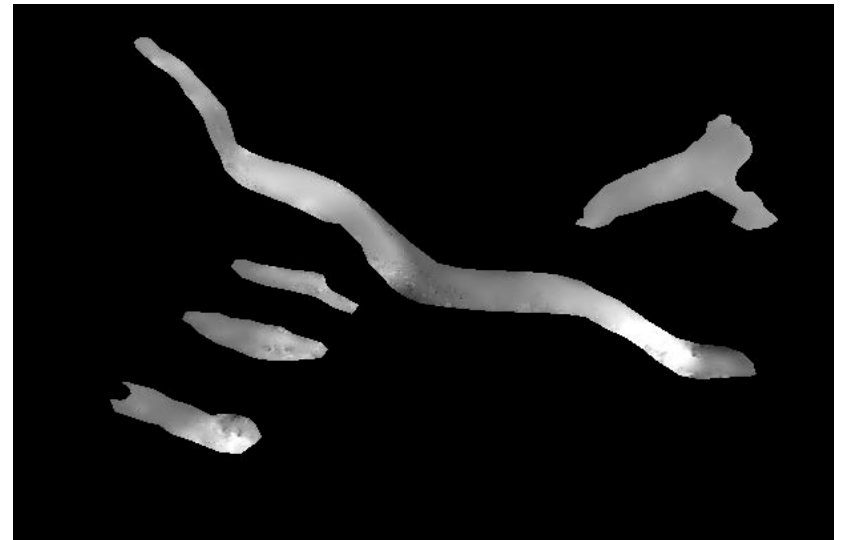


# D-InSAR phase unwrapping result

- Mer-de-glace glacier, ERS Tandem, weighted least-square phase unwrapping [Ghiglia and Romero, JOSA, 1994]



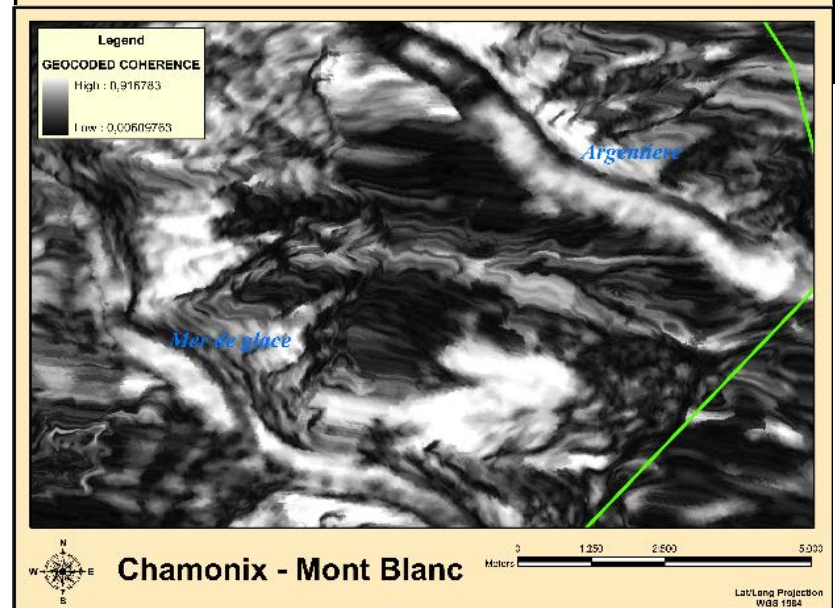
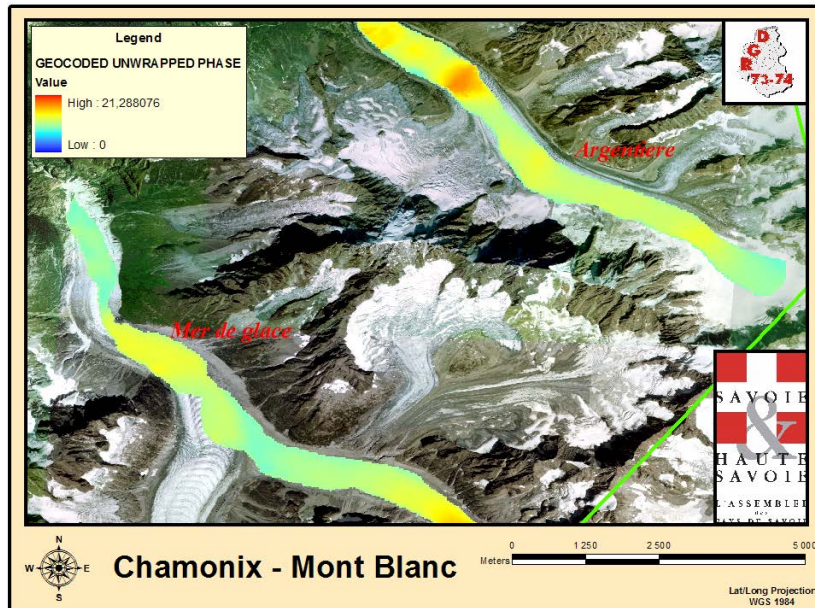
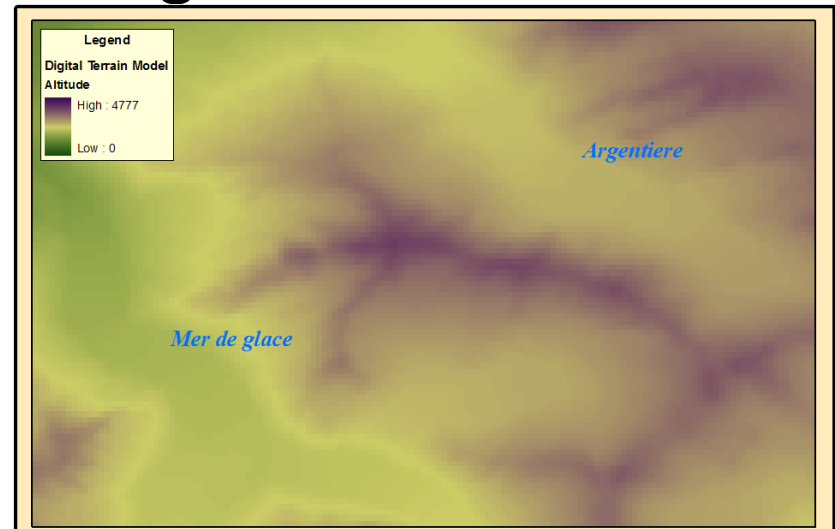
Filtered phase



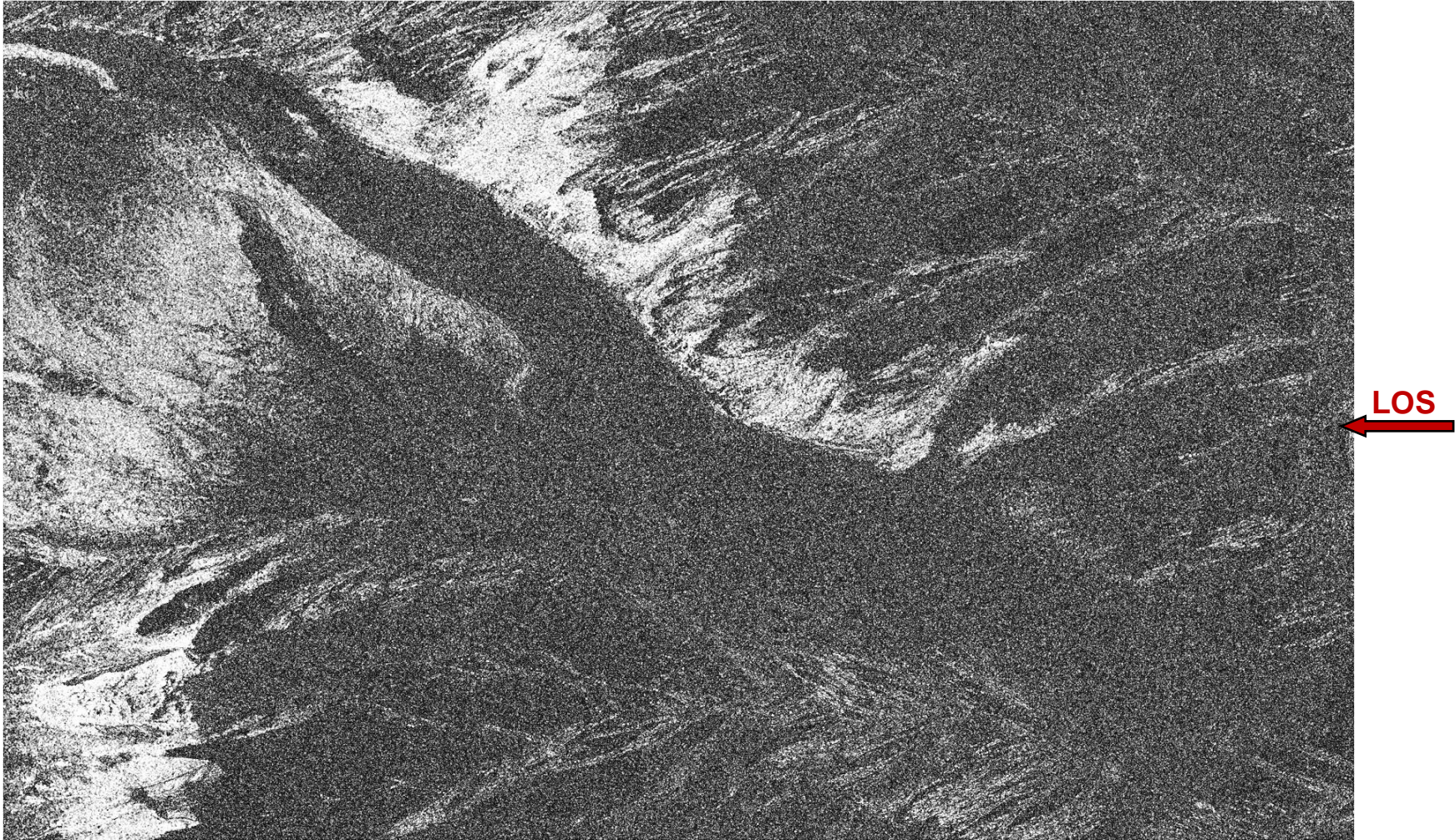
Unwrapped phase

# ERS, D-InSAR over Alpine glaciers [Trouvé-07]

- Combined results:
  - InSAR: LOS displacement
  - GPS: unwrapping offset
  - DTM: →geocoding  
→flow direction

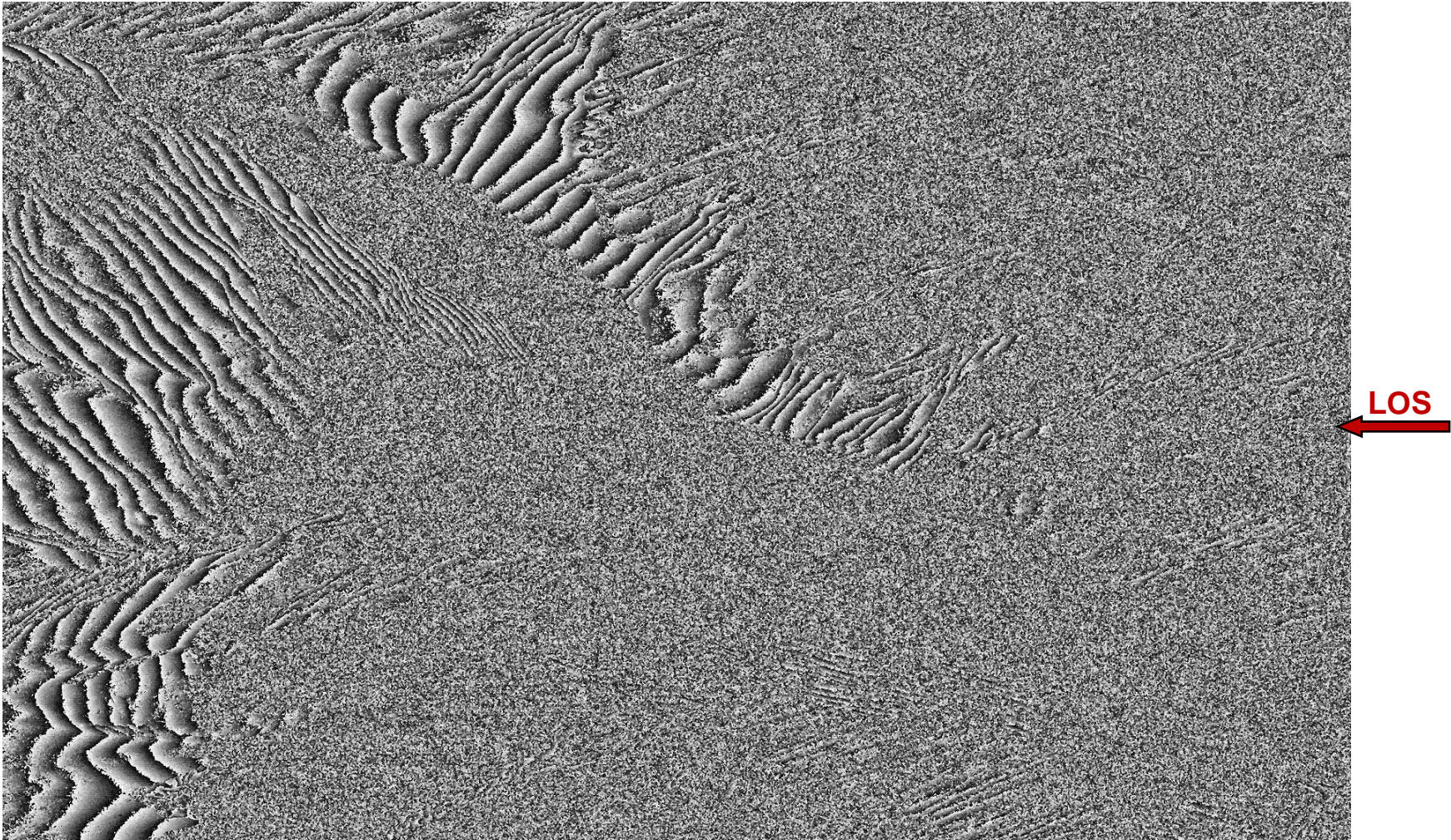


# Coherence limitation, TerraSAR-X



11-day pair, Sept. 29 / Oct. 10 2008, Argentière glacier

# Coherence limitation, TerraSAR-X

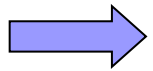


11-day pair, Sept. 29 / Oct. 10 2008, Argentière glacier

# Overview

## 1. Surface displacement by differential interferometry

- Potential and limits
- Processing steps
- Results from ERS tandem data



## 2. 2D/3D surface displacement by offset tracking

- Potential and limits
- Processing steps
- Results from TerraSAR-X stripmap images

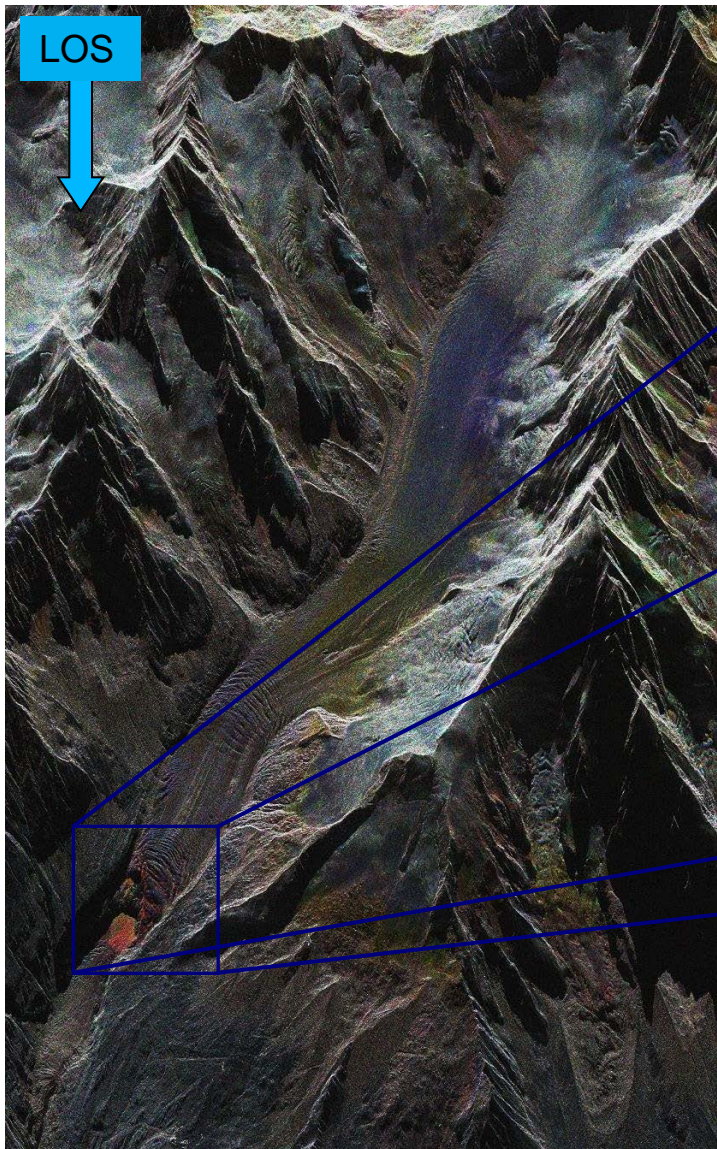
## 3. Surface elevation by SAR interferometry

- Potential and limits
- Processing steps
- Results from TanDEM-X data

## 4. How about Sentinel-1?

## 5. Perspectives

# Multi-temporal HR SAR images - TerraSAR-X (~2m)

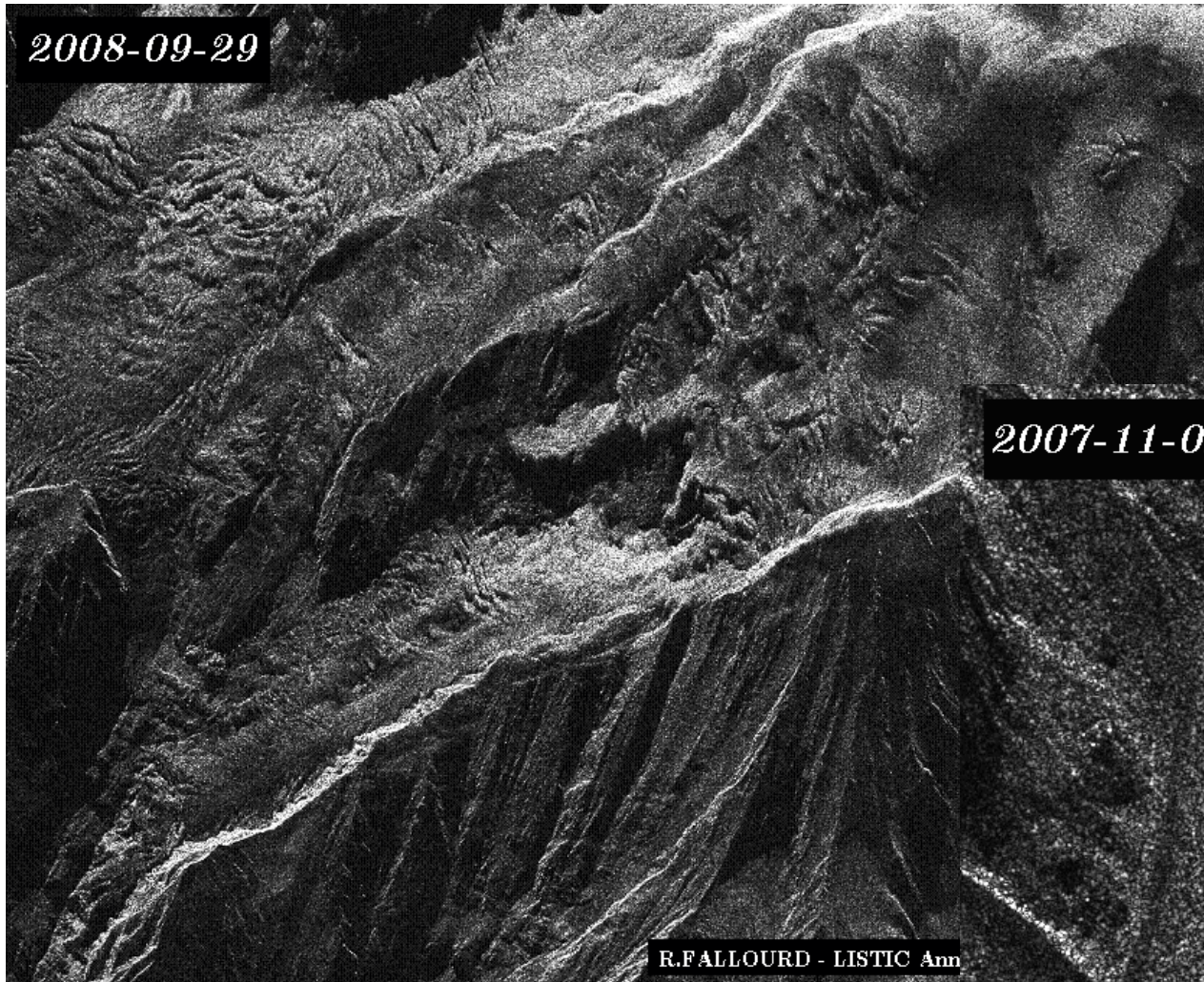


Argentière glacier ,  
RGB composition  
29/09/08,  
10/10/08,  
21/10/08



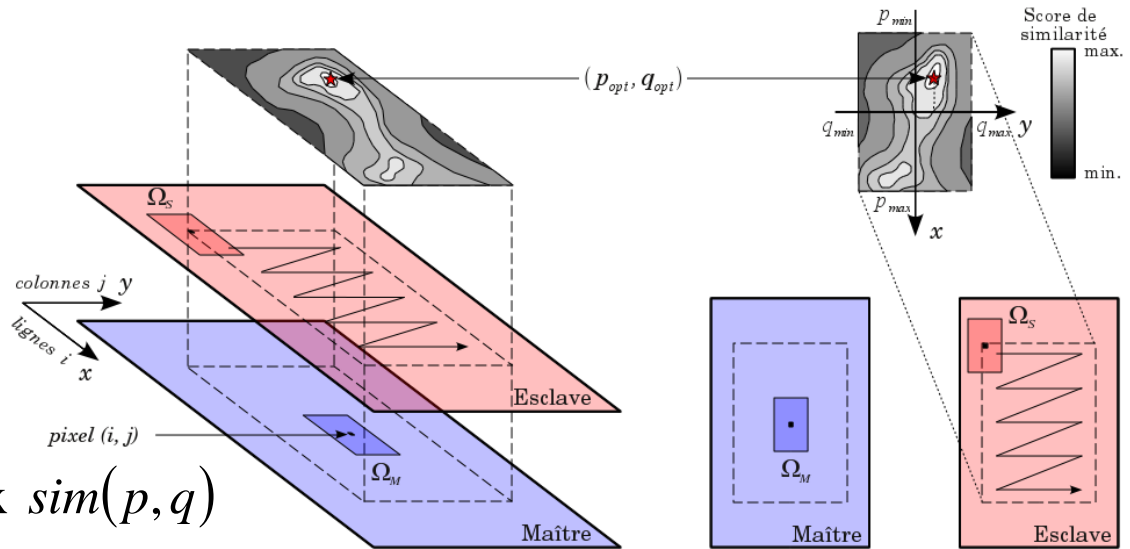


# Target / Feature tracking



# Offset tracking

## ■ Principle



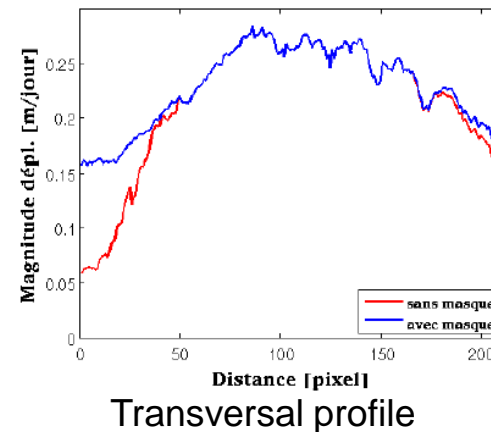
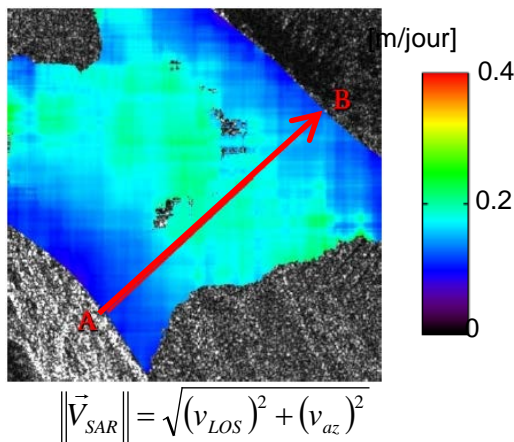
$$\vec{V}(i, j) = (p_{opt}, q_{opt}) = \arg \max_{(p, q) \in \Delta} sim(p, q)$$

## ■ Similarity functions

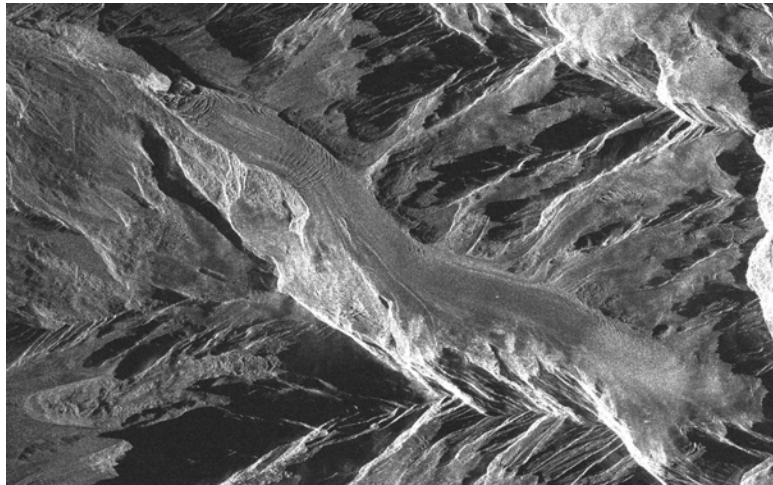
Normalized Cross-correlation	$NCC(p, q) = \frac{\sum_{(k, l) \in \Omega_M} I_m(k, l) I_s(k + p, l + q)}{\sqrt{\sum_{(k, l) \in \Omega_M}  I_m(k, l) ^2 \sum_{(k, l) \in \Omega_M}  I_s(k + p, l + q) ^2}}$
Decorrelated speckle [Erten et al. 2009]	$UML(p, q) = \sum_{(k, l) \in \Omega_M} (I_m(k, l) - I_s(k + p, l + q) - 2 \ln(1 + e^{(I_m(k, l) - I_s(k + p, l + q))}))$
Correlated speckle [Erten et al. 2009]	$CML(p, q) = (I_m(k, l) - I_s(k + p, l + q) - 2 \ln(1 + e^{(I_m(k, l) - I_s(k + p, l + q))})) \dots - \left(1 + \frac{1}{2N}\right) \ln \left(1 - \frac{4\rho e^{(I_m(k, l) - I_s(k + p, l + q))}}{(1 - e^{(I_m(k, l) - I_s(k + p, l + q))})}\right)$

# Potential and limits

- Large windows (at least 64x64)
- Speckle:
  - If correlated → speckle tracking (lower precision than InSAR in LOS)
  - If not → texture/feature tracking in textured areas, on targets...
- Border effect → mask / adaptive windows



# Offset tracking over Argentière glacier



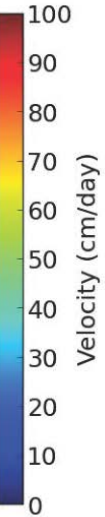
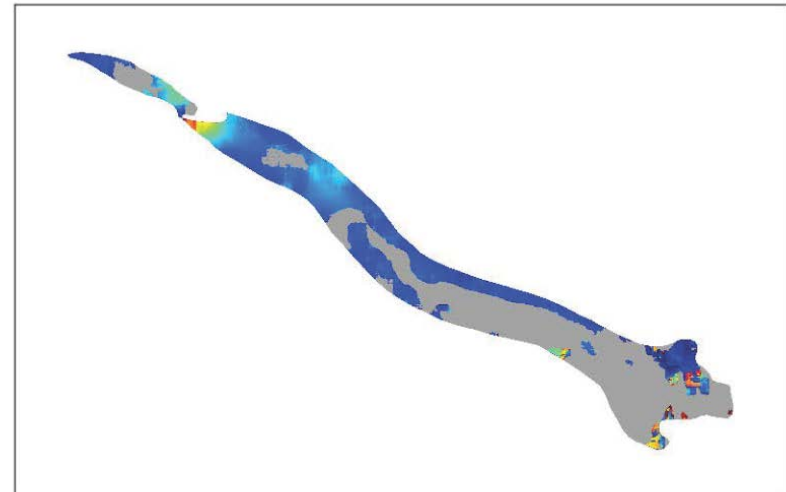
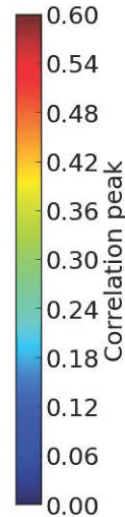
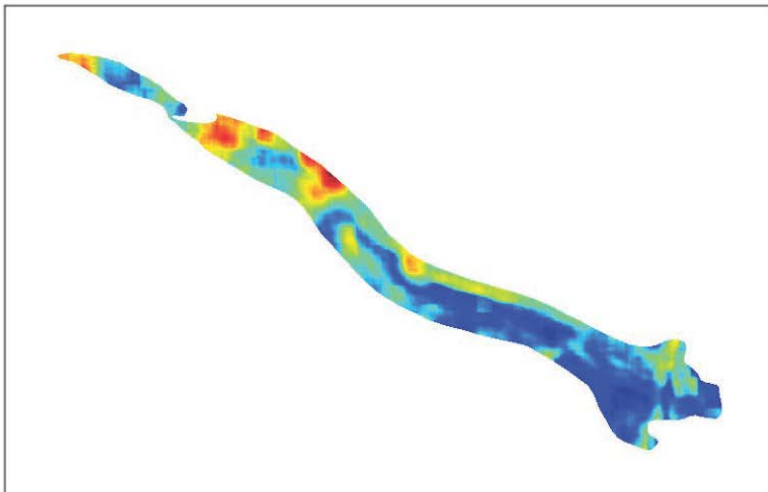
LOS  
←

Argentière glacier

TerraSAR-X stripmap (~2m)

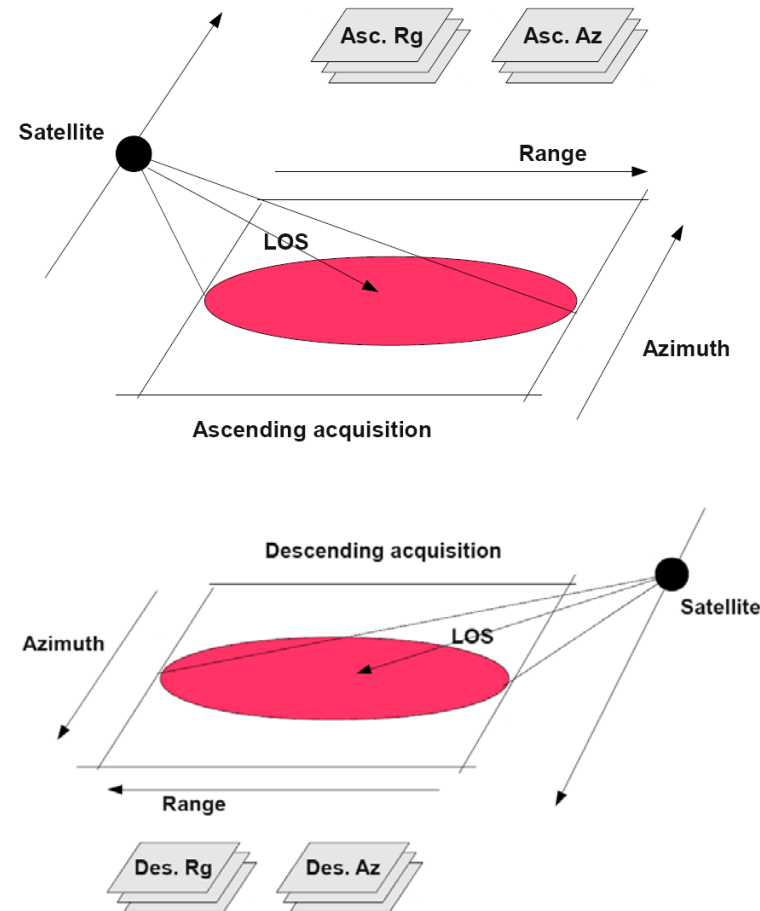
2009/08/14-2009/08/25 pair

Correlation threshold: 0.2



# Combining multiple displacement measurements

- D-InSAR:
  - ➔ 1D displacement (LOS)
- Offset tracking:
  - ➔ 2D displacement in LOS and azimuth directions
- Ascending and descending passes
  - ➔ 4 projections
- Multi-temporal data
  - ➔ repeated measurements
- Inversion strategies / uncertainty management [Yan 11, 12]
  - ➔ 3D displacement (E, N, Up)
  - ➔ Physical model parameters



# 3D displacement fields

- Requirement:
  - ~simultaneous Asc/Des pairs
  - Textured areas visible in both geometries
  - DEM for orthorectification

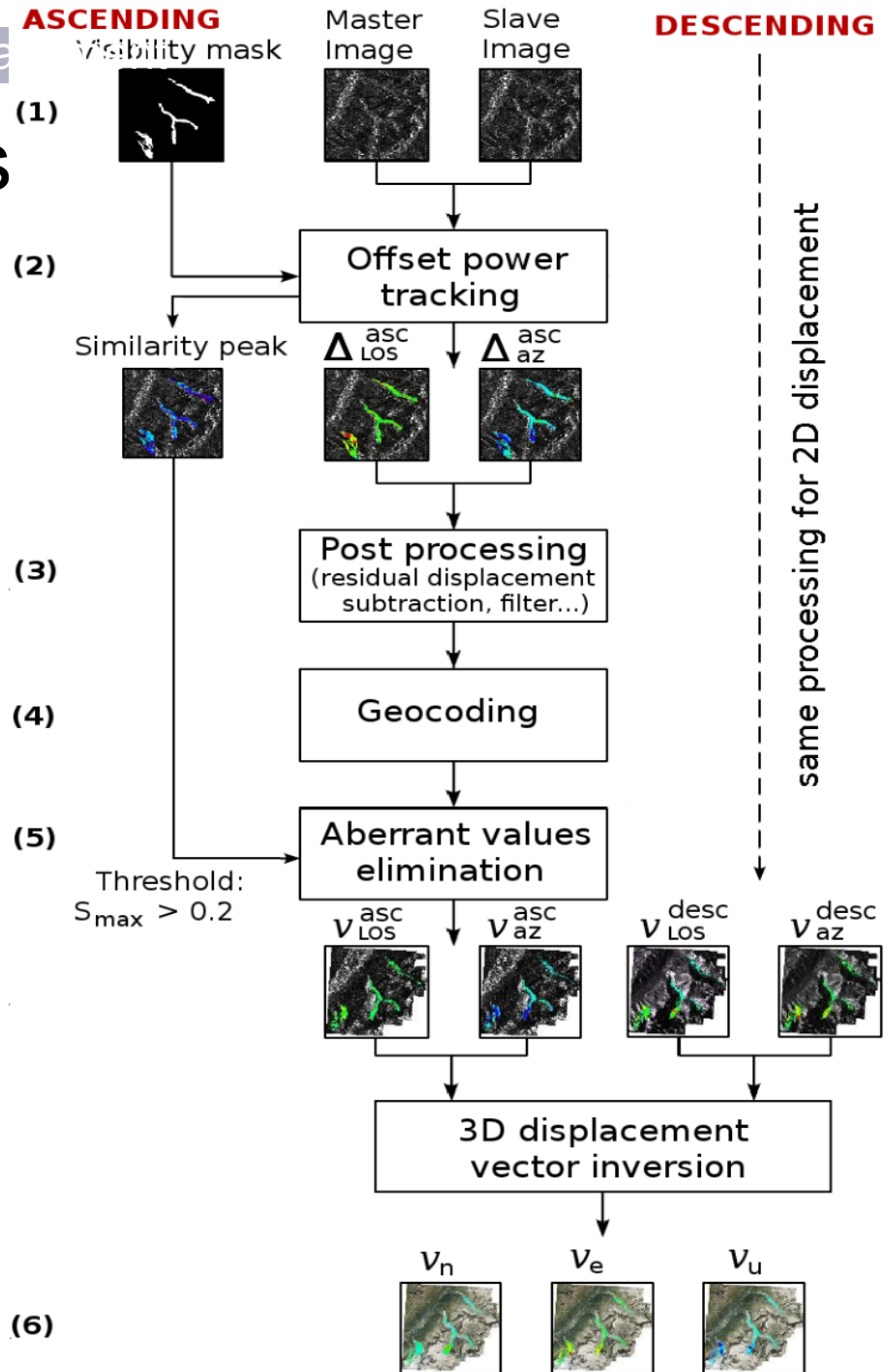
## Inverse problem:

$$\mathbf{V} = \mathbf{P} \times \mathbf{D} \quad \mathbf{D} = [v_e, v_n, v_u]^t$$

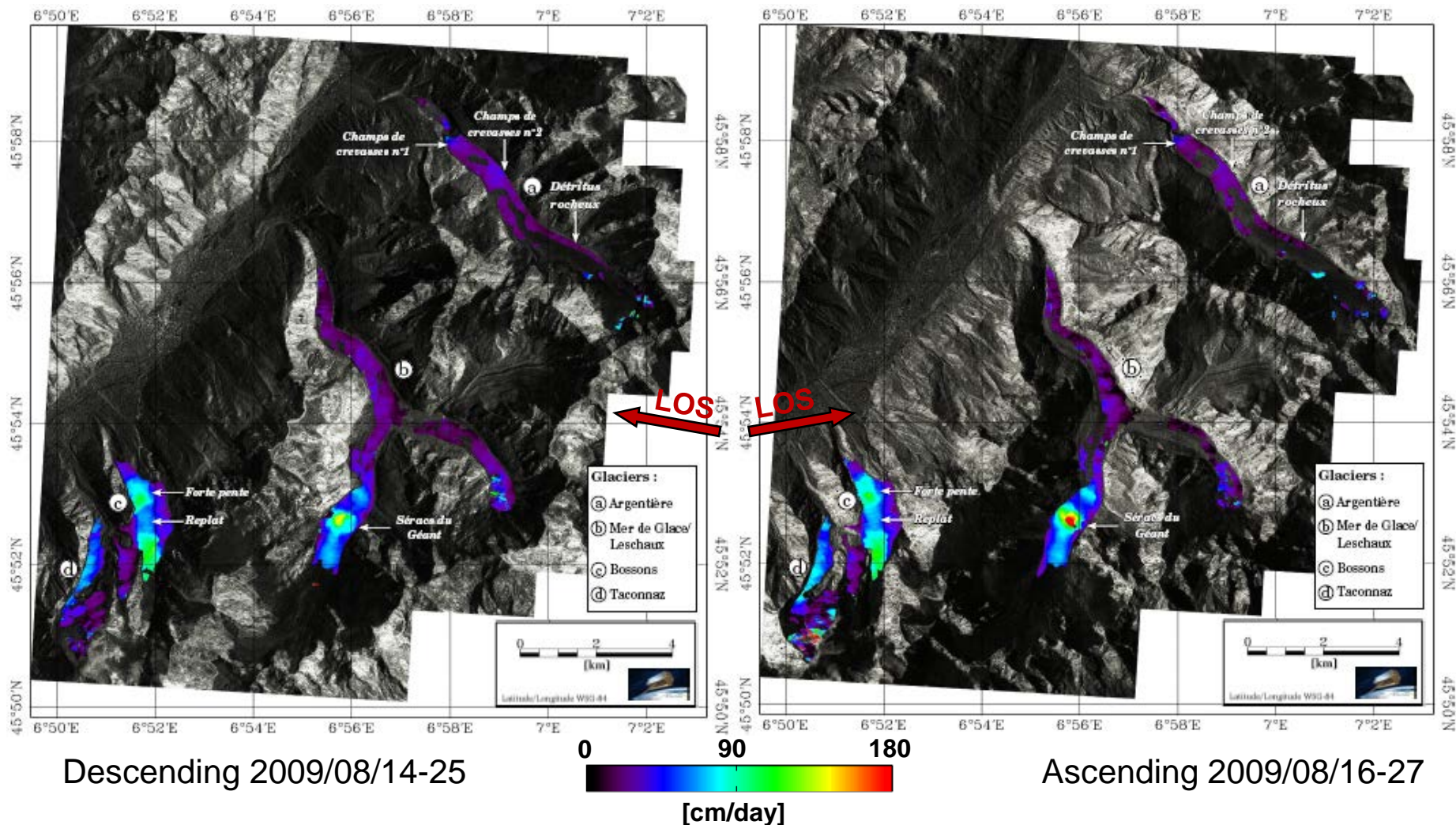
$\mathbf{P}$  projections Asc / Des  
 $\mathbf{V}$  measurements

## Least square solution:

$$\mathbf{D} = (\mathbf{P}^t \times \mathbf{P})^{-1} \times \mathbf{P}^t \times \mathbf{V}$$

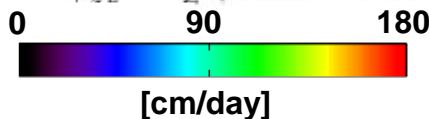


# TSX Ascending/Descending 2D displacement fields



Descending 2009/08/14-25

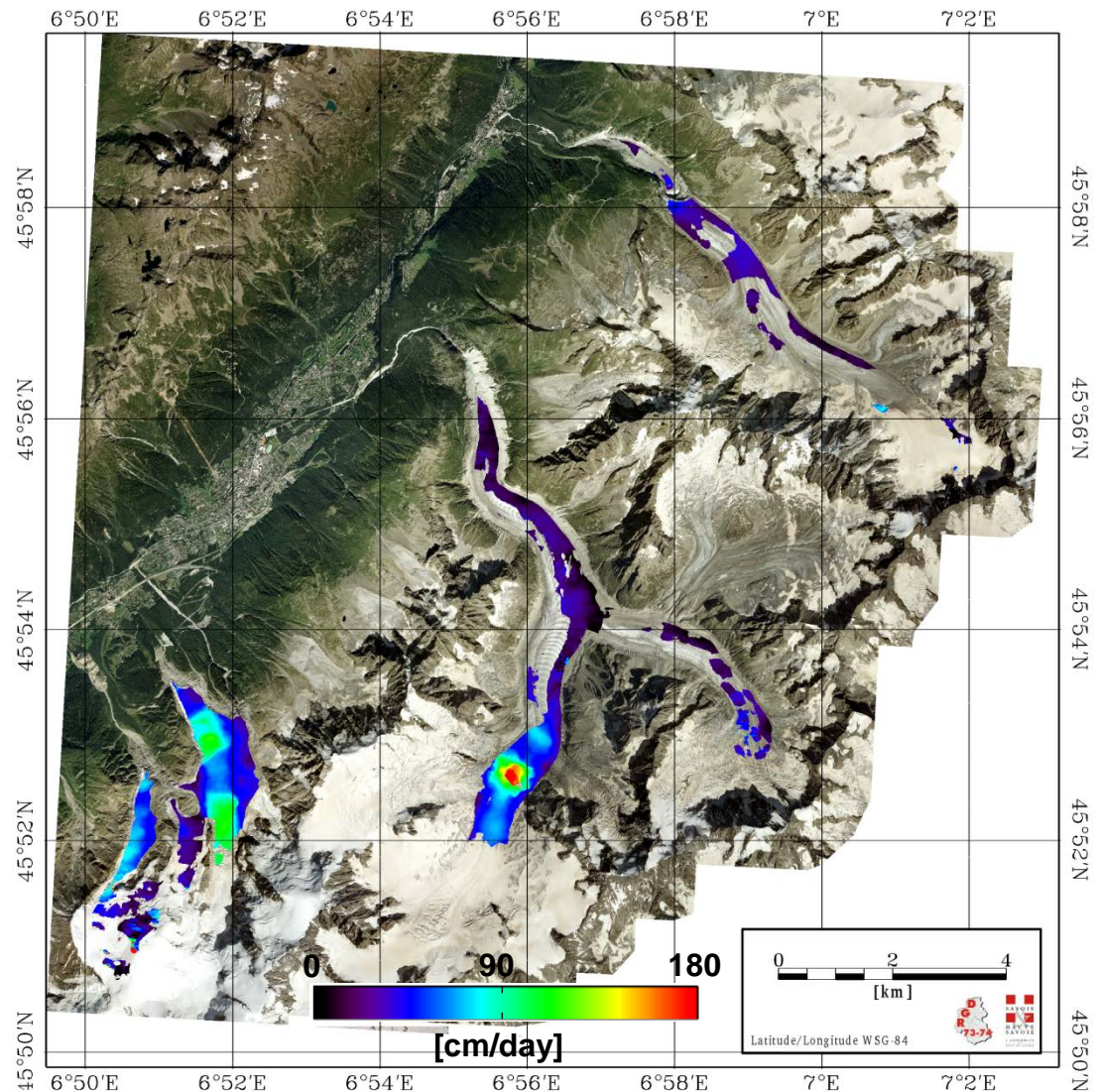
Ascending 2009/08/16-27



# 3D glacier displacement field from high resolution amplitude images

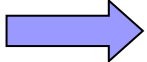
## Chamonix Mont-Blanc

- TerraSAR-X stripmap images, res.: ~2m
- 11-day pairs
- Descending and ascending (d+2)  
[Fallourd 11, 12]





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# TanDEM-X mission

- 2 SAR satellites, 250-500m baseline
- primary objective : global DEM with vertical relative accuracy of 2m (4m slope >20%) and 12m posting
- dual baseline processing:
  - 2 acquisitions with heights of ambiguity of 25-30m and 35-40m
  - for difficult terrains, several acquisitions with different geometries (look direction, incidence angle...)
- Difficulties for glaciological applications:
  - rapid changes (ablation/accumulation)
  - Snow / firn / ice penetration



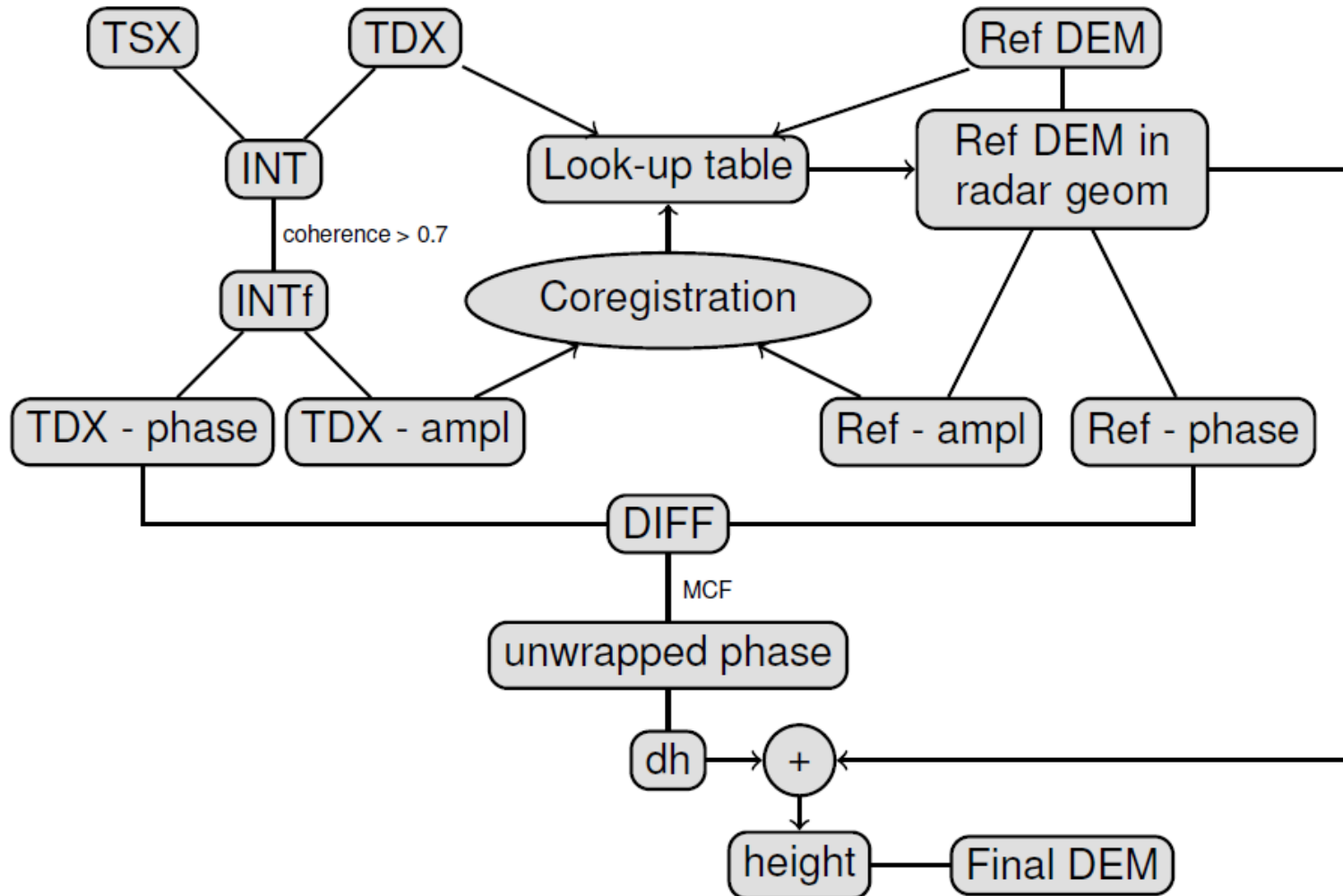
# TanDEM-X pairs over Chamonix Mont Blanc

Date	Orbit	Bperp (m)	HoA (m)	Incidence
2012/05/13	Ascending	176.3	30.3	44°
2012/05/24	Ascending	170.8	31.0	44°
2013/02/01	Ascending	122.8	58.8	44°
2013/10/21	Descending	80.4	63.7	37°
2013/11/12	Descending	95.0	62.3	37°

## Reference DEMs

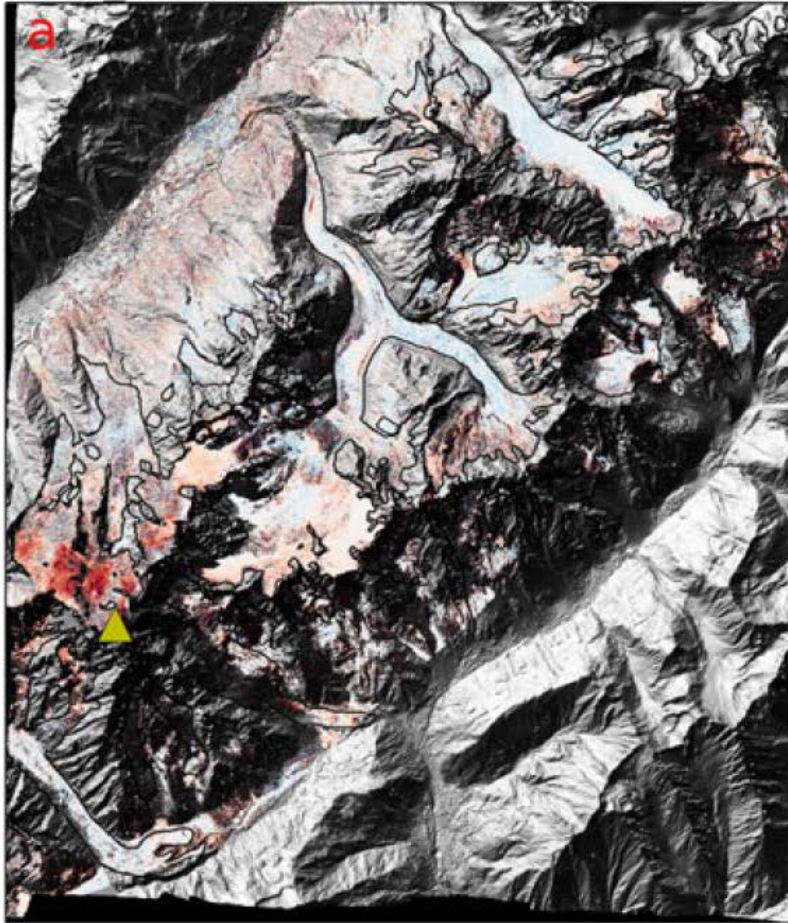
Source	Date	Posting (m)
Pléiades	2012/08/19	4
Pléiades	2013/09/20	4
SRTM-C	Feb. 2000	30

# Processing chain

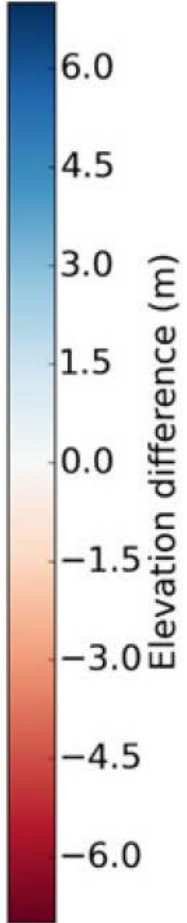


# TanDEM-X – Pléiades elevation difference

TDX 20131021 - Pleiades 20130920



TDX 20130201 - Pleiades 20120819



[Dehecq 2016]

# TanDEM-X – Pléiades elevation difference

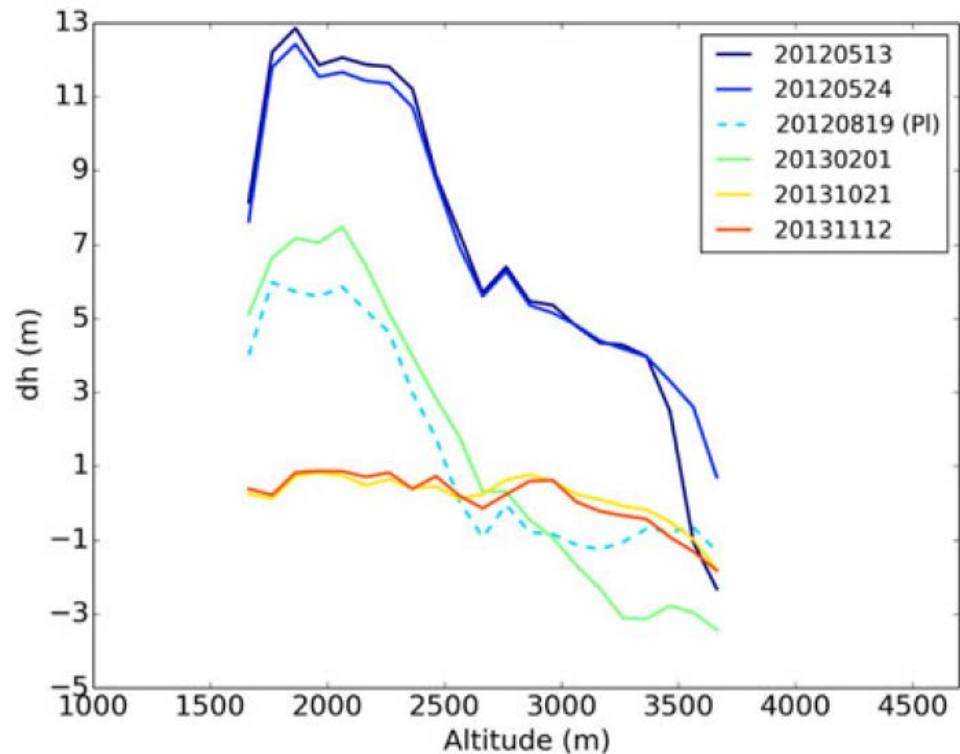
- Uncertainty assessed below 2000-m a.s.l., excluding glaciers, vegetation and slopes  $> 40^\circ$ ,
- Reference: Pléiades 2012/08/19

TDX pair	Mean (m)	Median (m)	MAD
2012/05/13	1.41	1.88	3.10
2012/05/24	1.16	1.56	2.97
2013/02/01	0.83	1.94	2.65
2013/10/21	-1.14	-0.07	1.92
2013/11/12	-1.33	-0.14	1.99

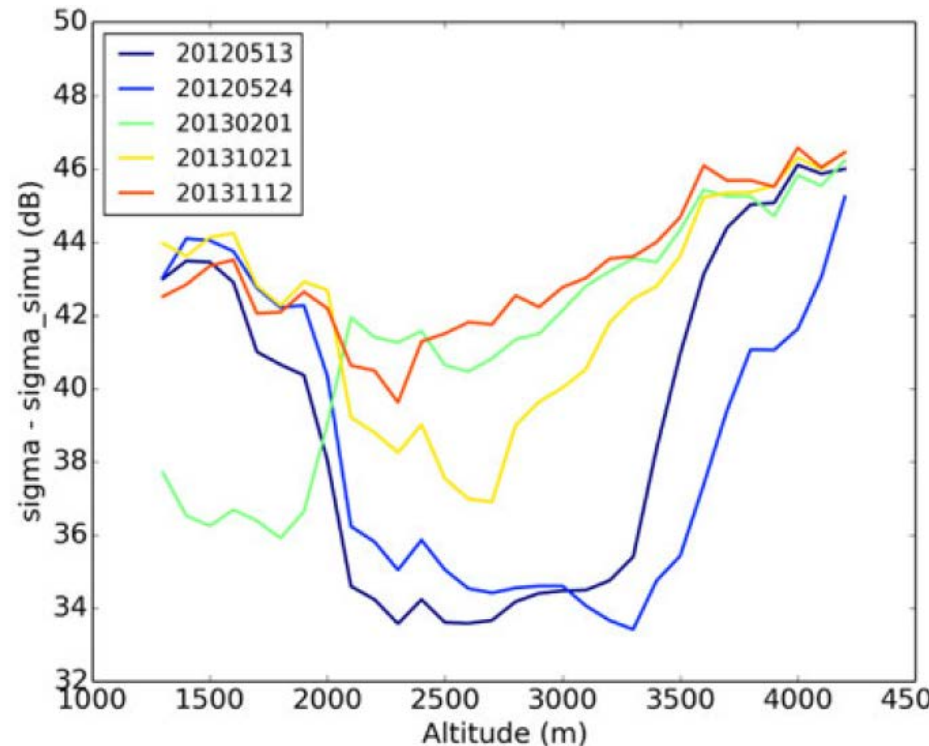
[Dehecq 2016]

# Limitations

- radar penetration in dry snow



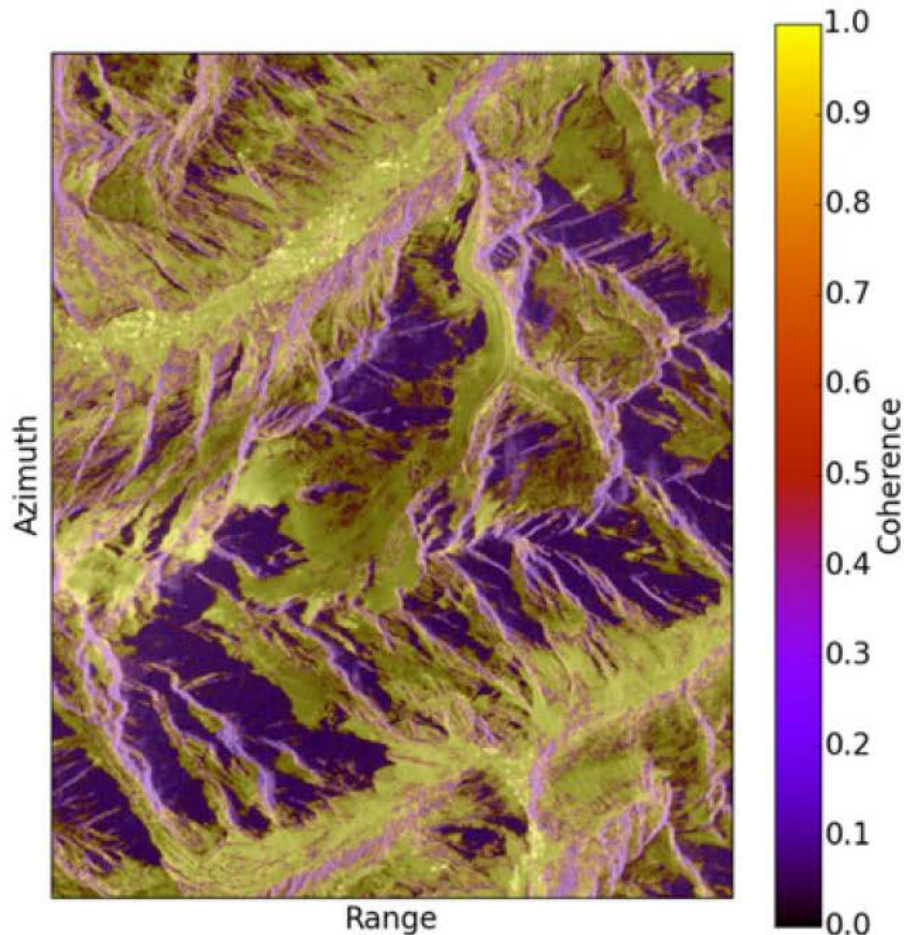
Elevation difference on the Mer-de-Glace between:  
- 5 TDX+Pléiades 2012 DEMs  
- the Pléiades 2013/09/20 DEM



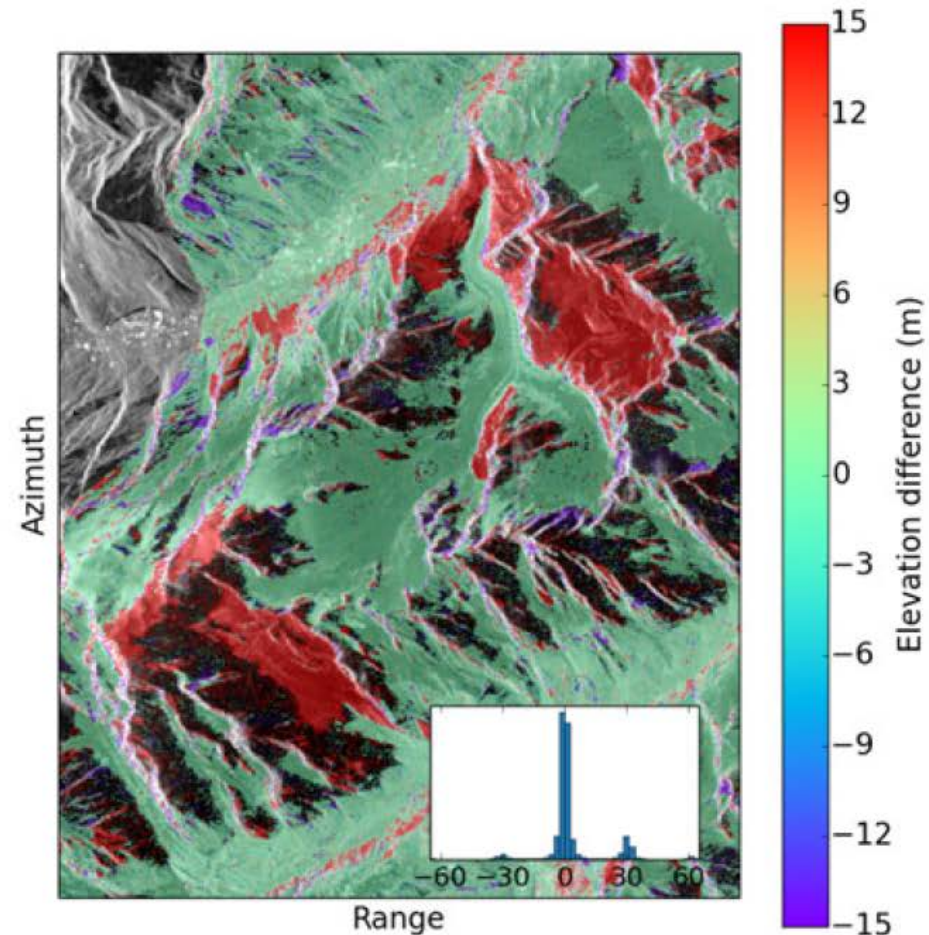
Flattened backscattering coef in dB  
for the 5 TDX pairs, for all glaciers

# Limitations

- Unwrapping errors using SRTM as reference DEM



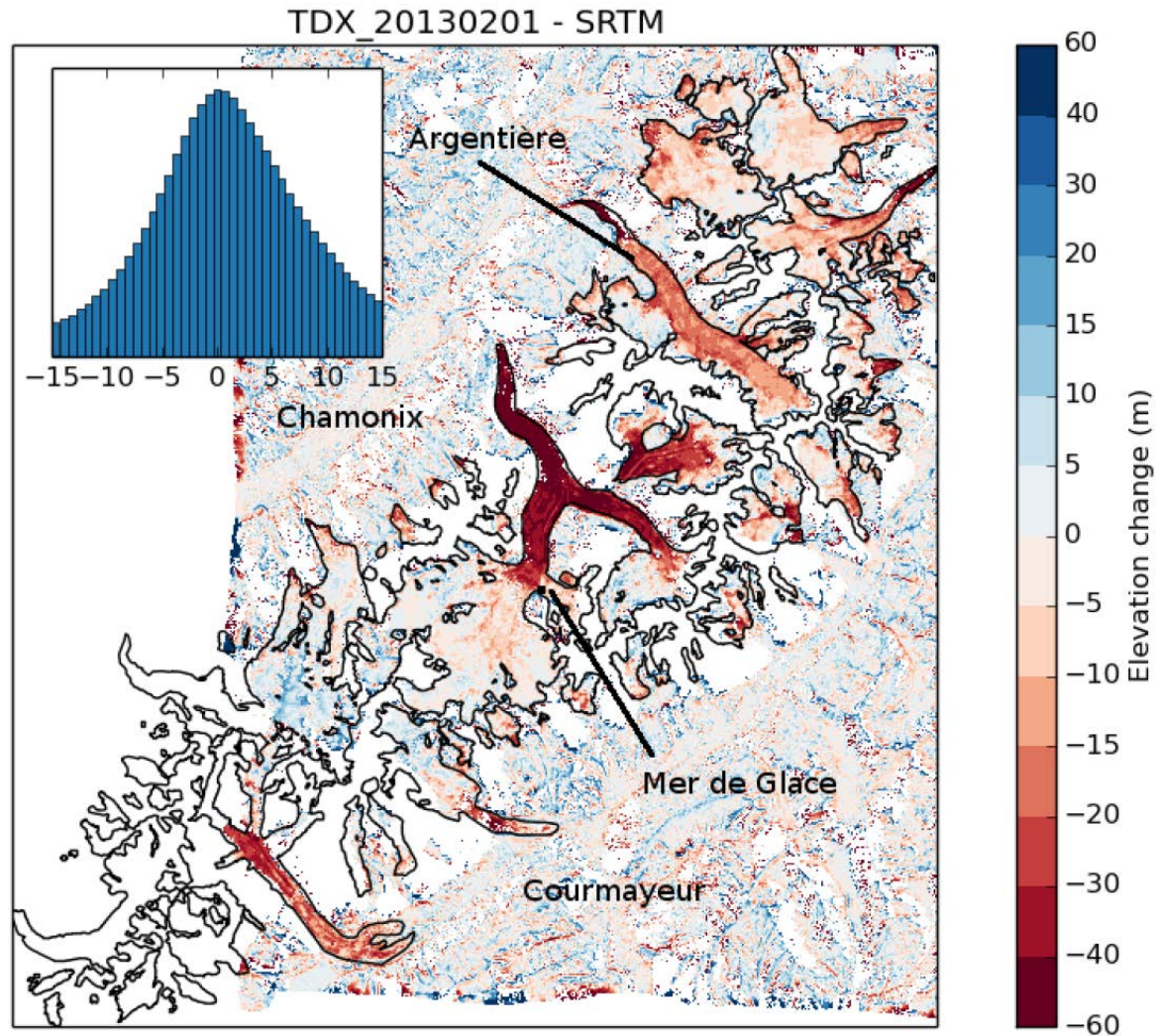
Coherence



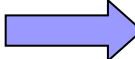
Elevation difference: TDX pair 2012/05/13 (HoA = 30.3 m) - Pléiades 2013 (right)



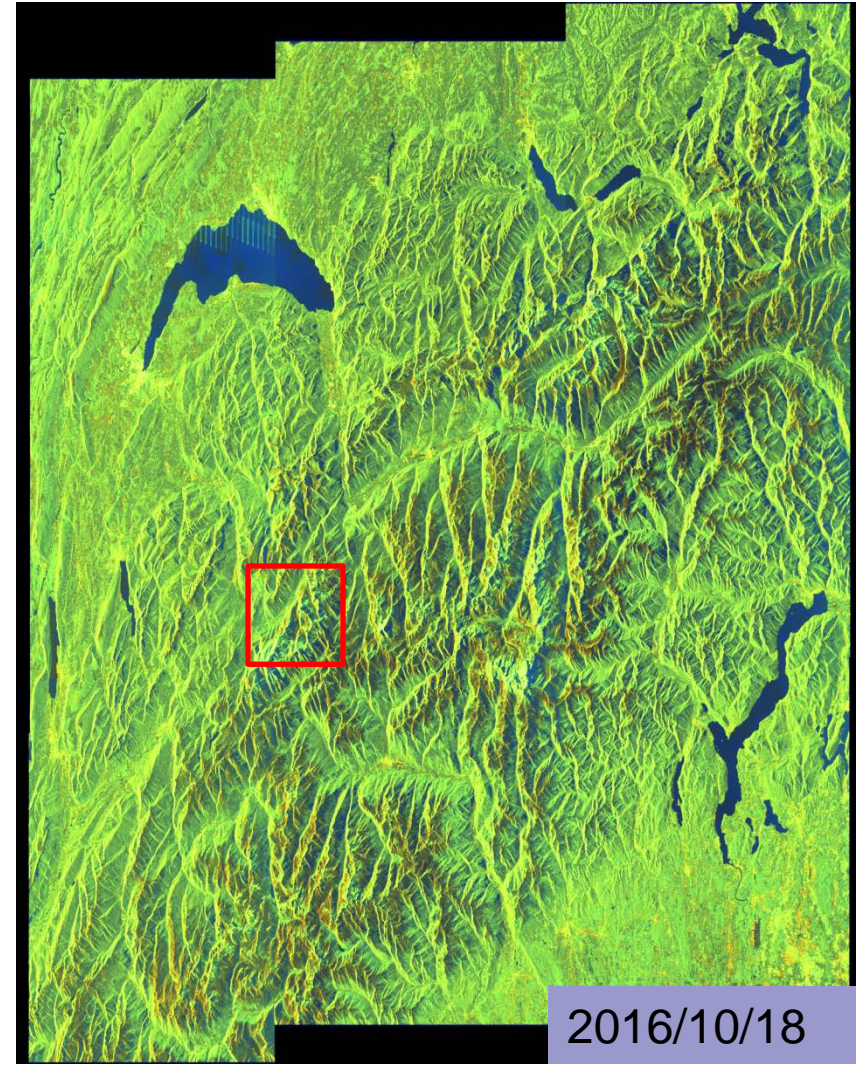
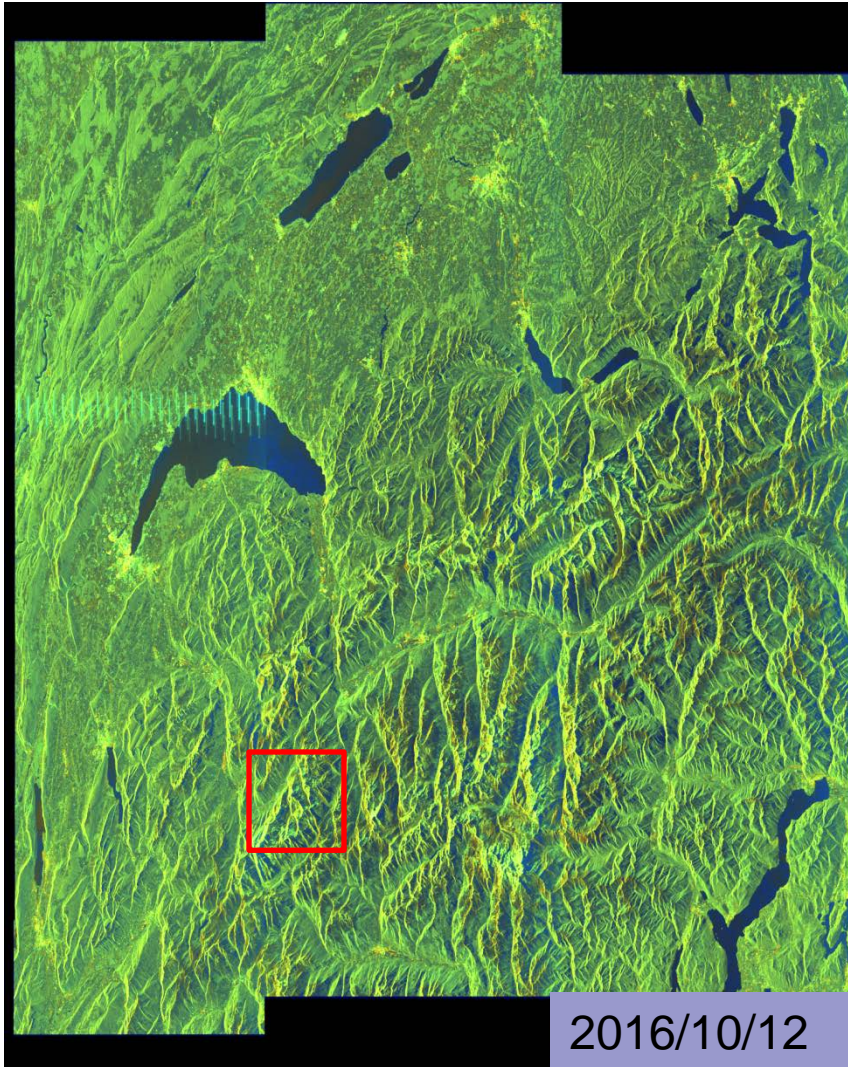
# TanDEM-X – SRTM elevation difference



# Overview

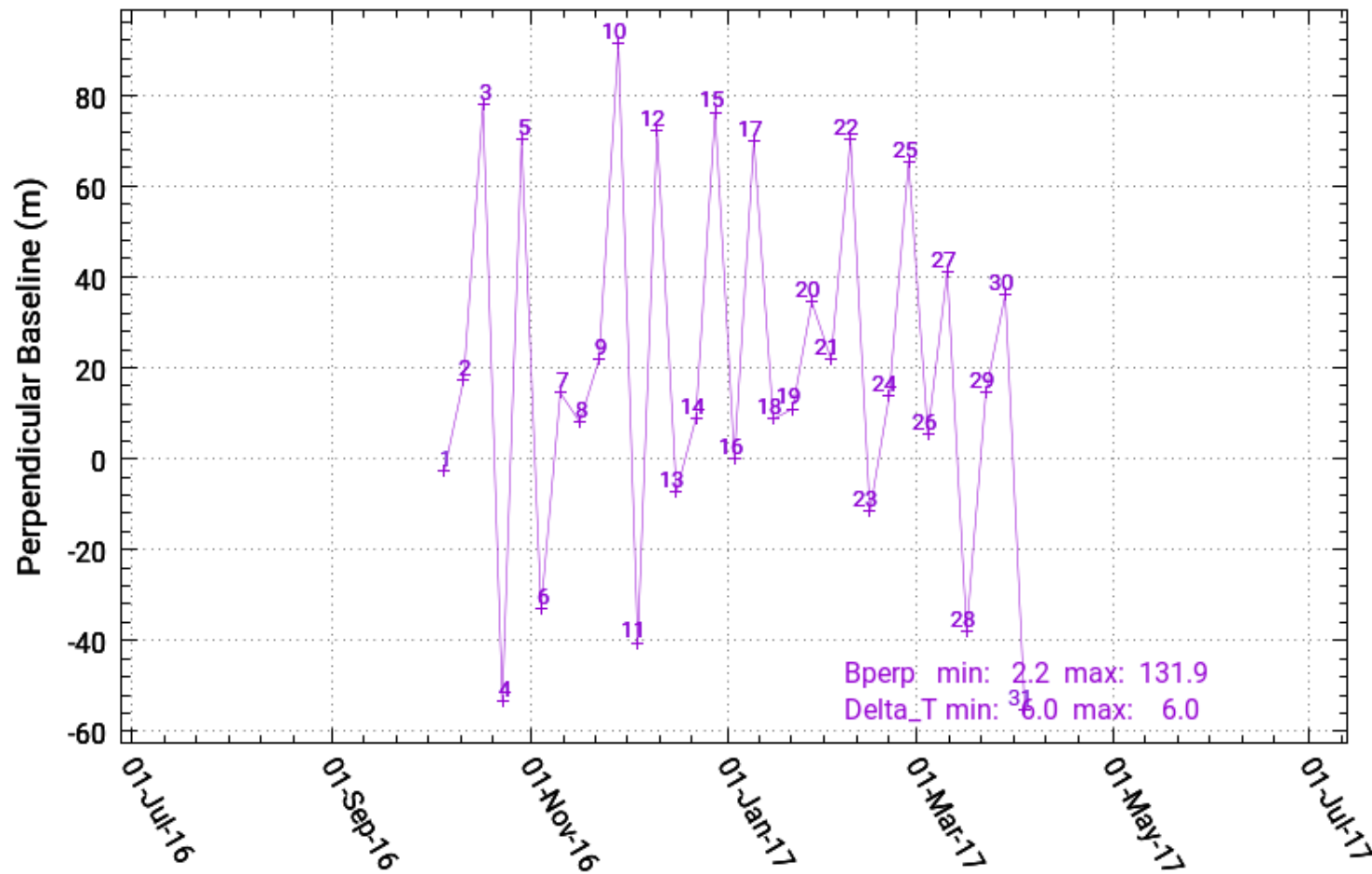
1. Surface displacement by differential interferometry
  - Potential and limits
  - Processing steps
  - Results from ERS tandem data
2. 2D/3D surface displacement by offset tracking
  - Potential and limits
  - Processing steps
  - Results from TerraSAR-X stripmap images
3. Surface elevation by SAR interferometry
  - Potential and limits
  - Processing steps
  - Results from TanDEM-X data
-  4. How about Sentinel-1?
5. Perspectives

# Sentinel 1 – Ascending orbit 88 - Quicklook

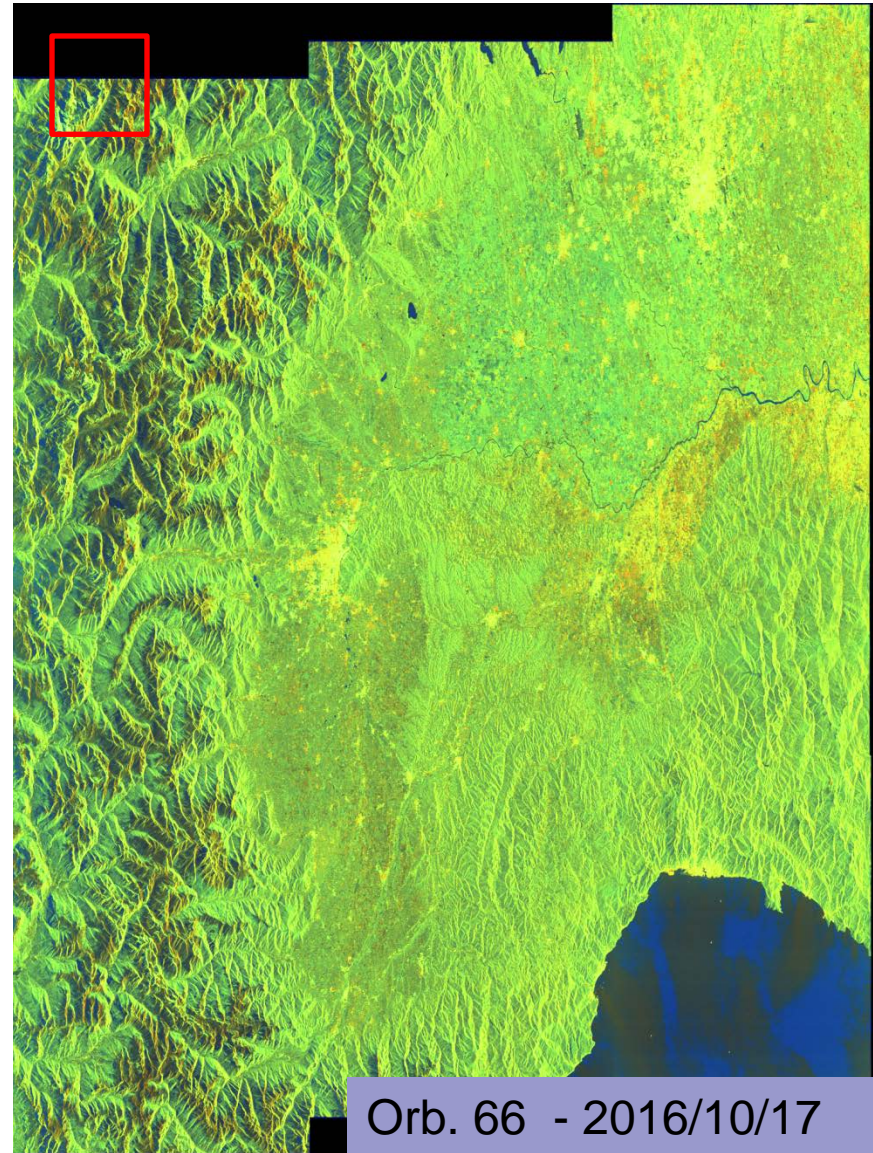
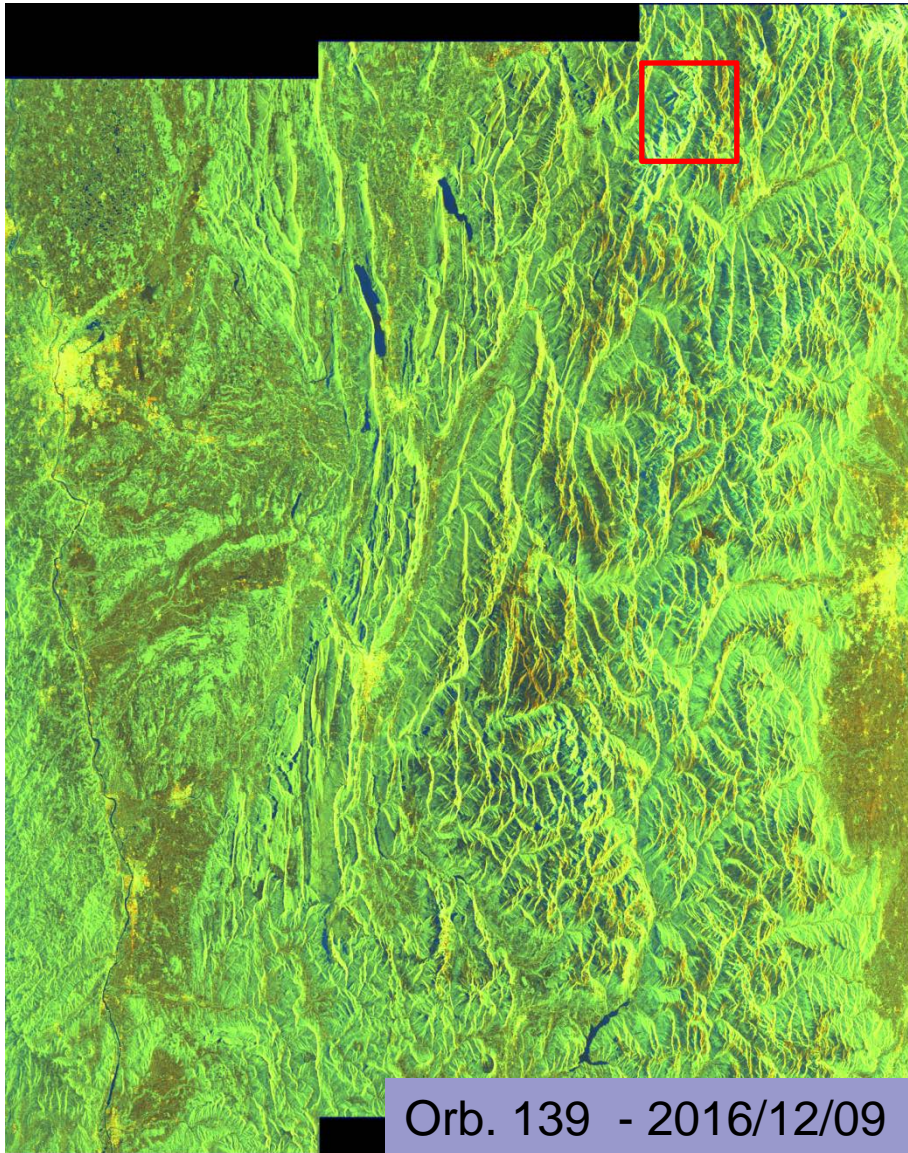


# Sentinel 1 – Ascending orbit – Perp. baseline

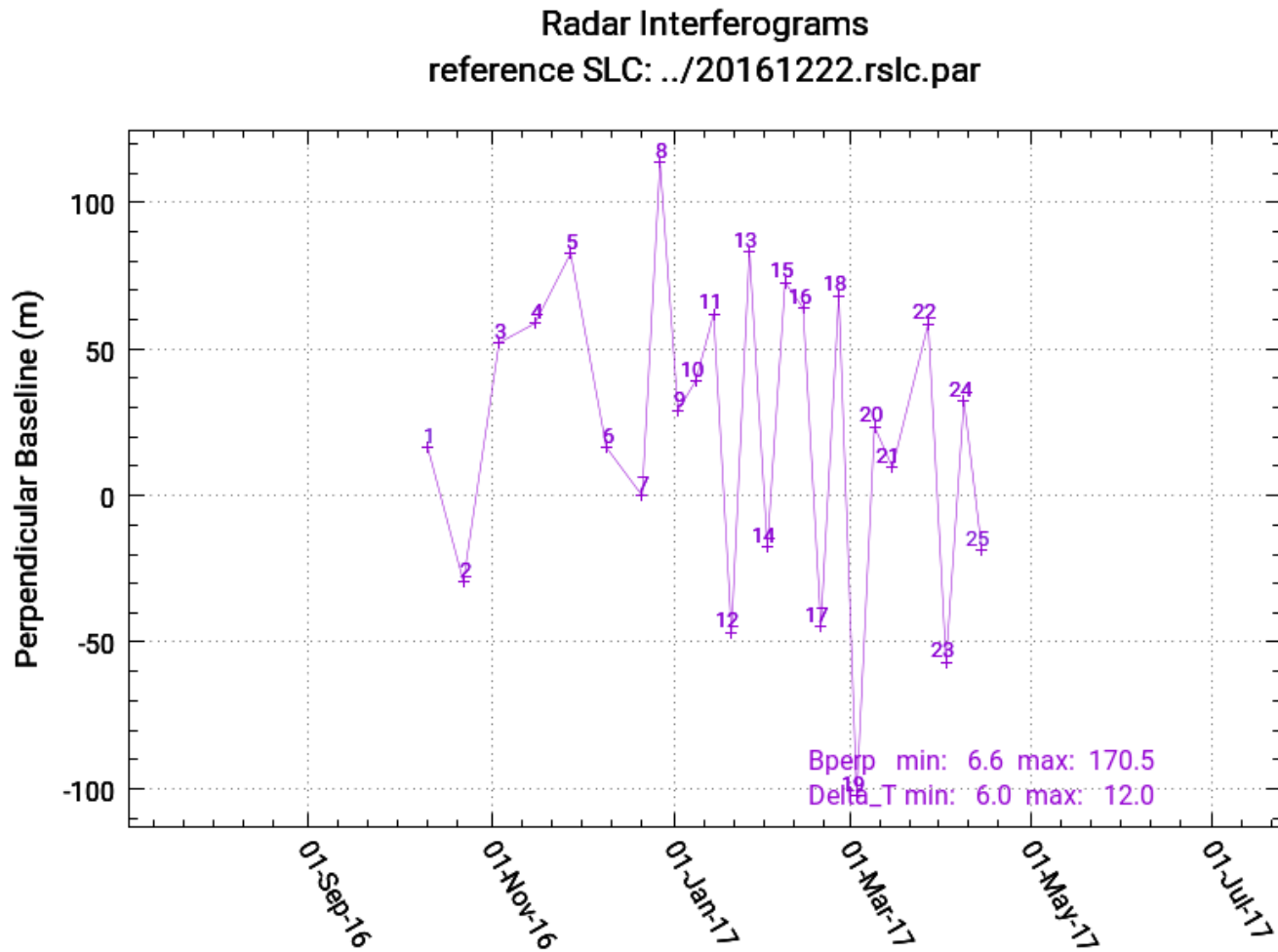
Radar Interferograms  
reference SLC: ../20170104.rslc.par



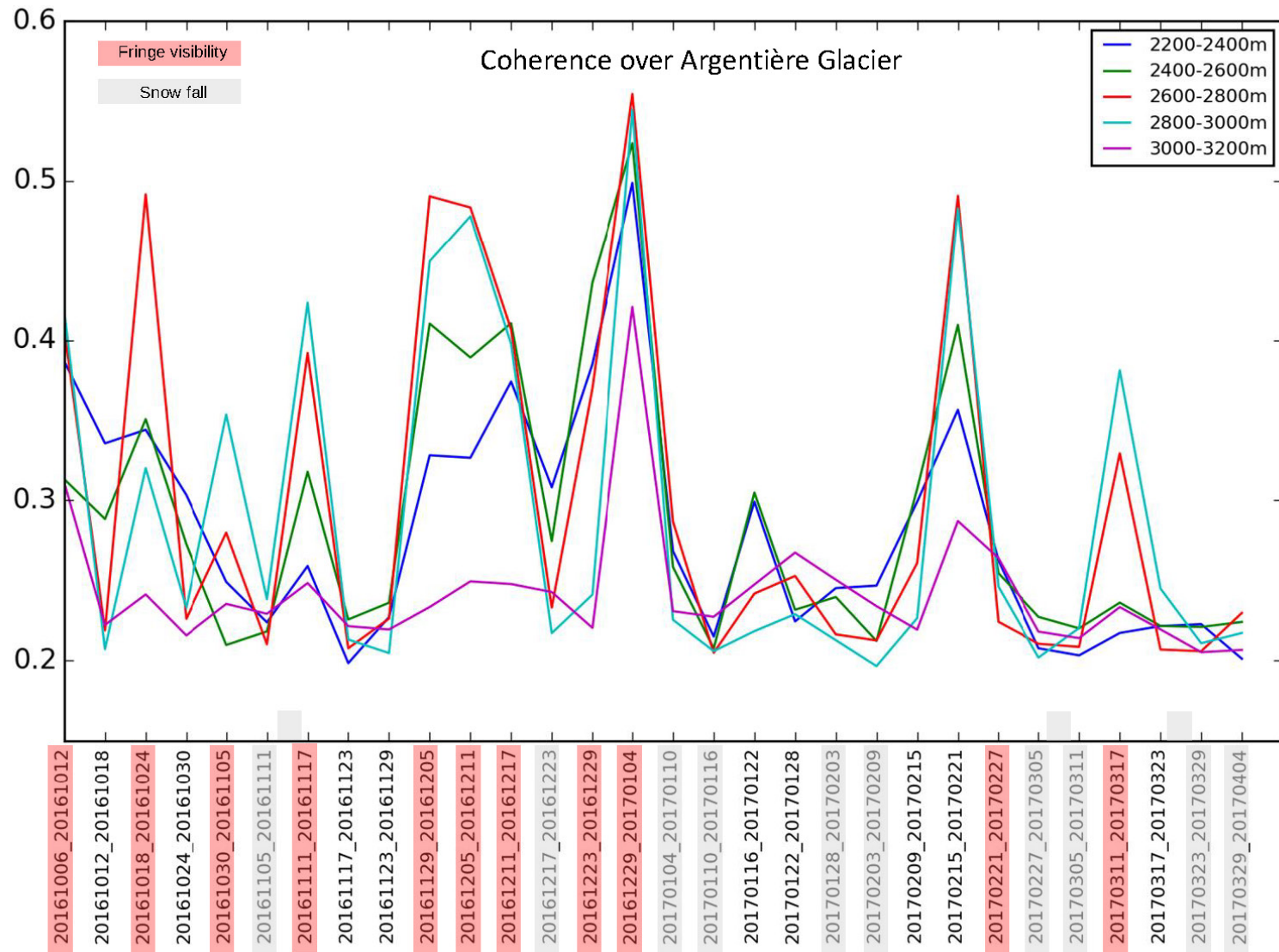
# Sentinel 1 – Descending orbits - Quicklook



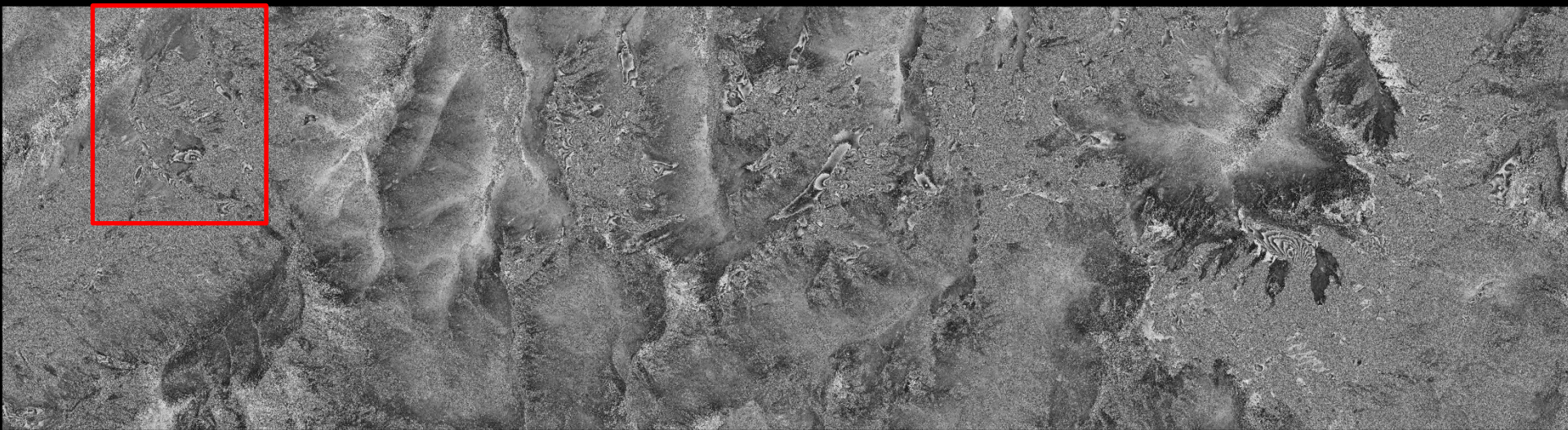
# Sentinel 1 – Descending orbit – Perp. baseline



# Sentinel1-Ascending, coherence time profile



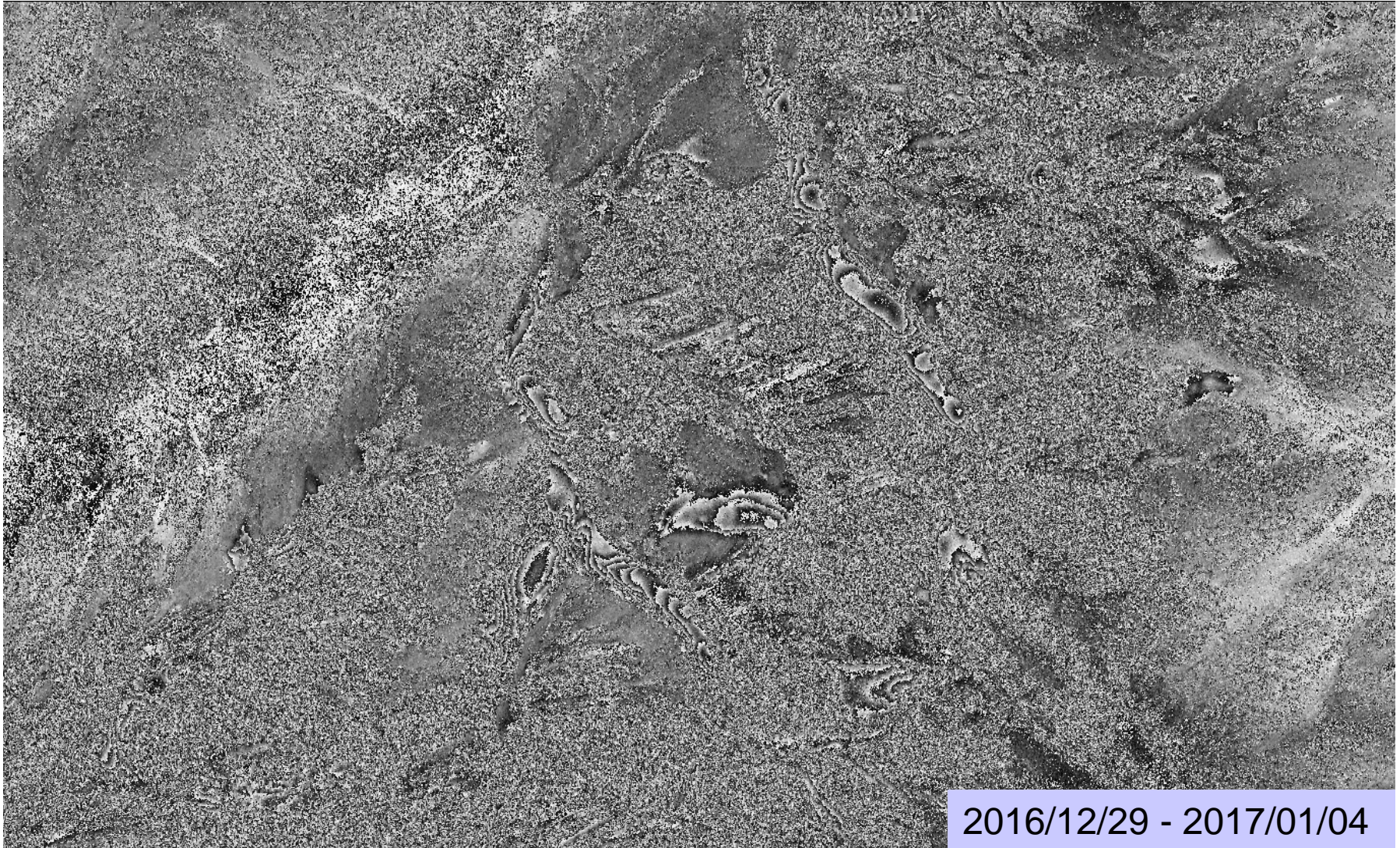
# Sentinel1-Ascending, D-InSAR (1 burst)



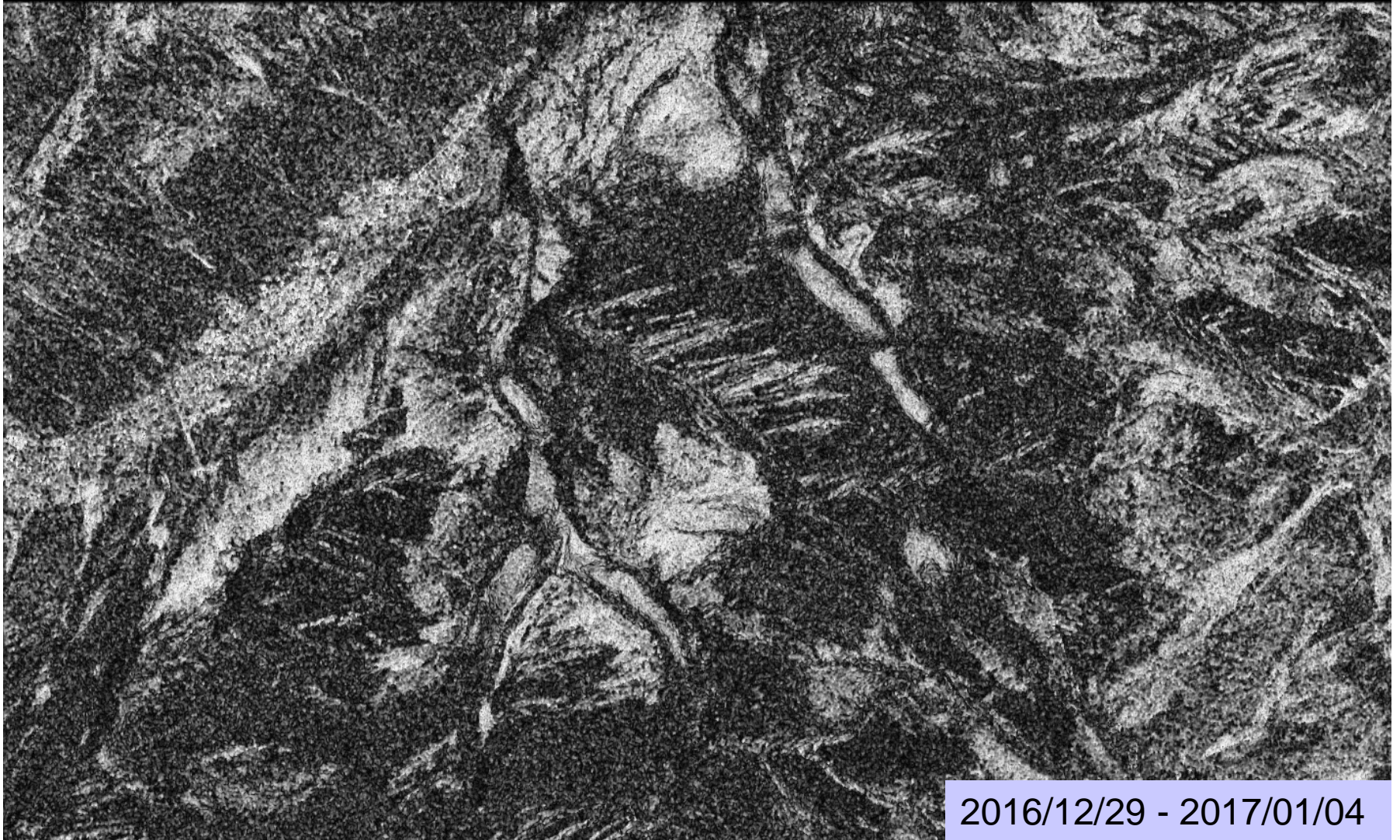
2016/12/29 - 2017/01/04



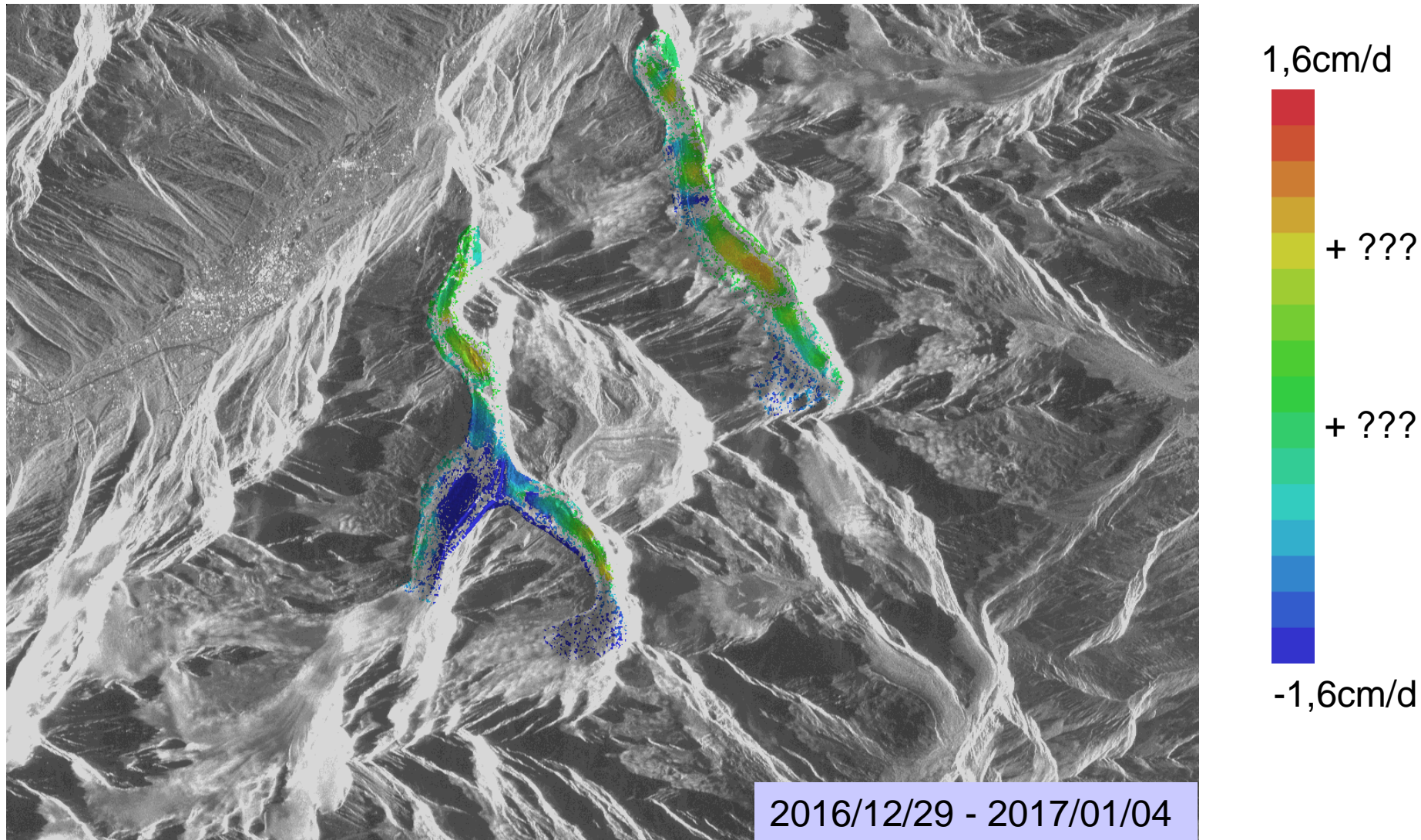
# Sentinel1-Ascending, D-InSAR interferogram



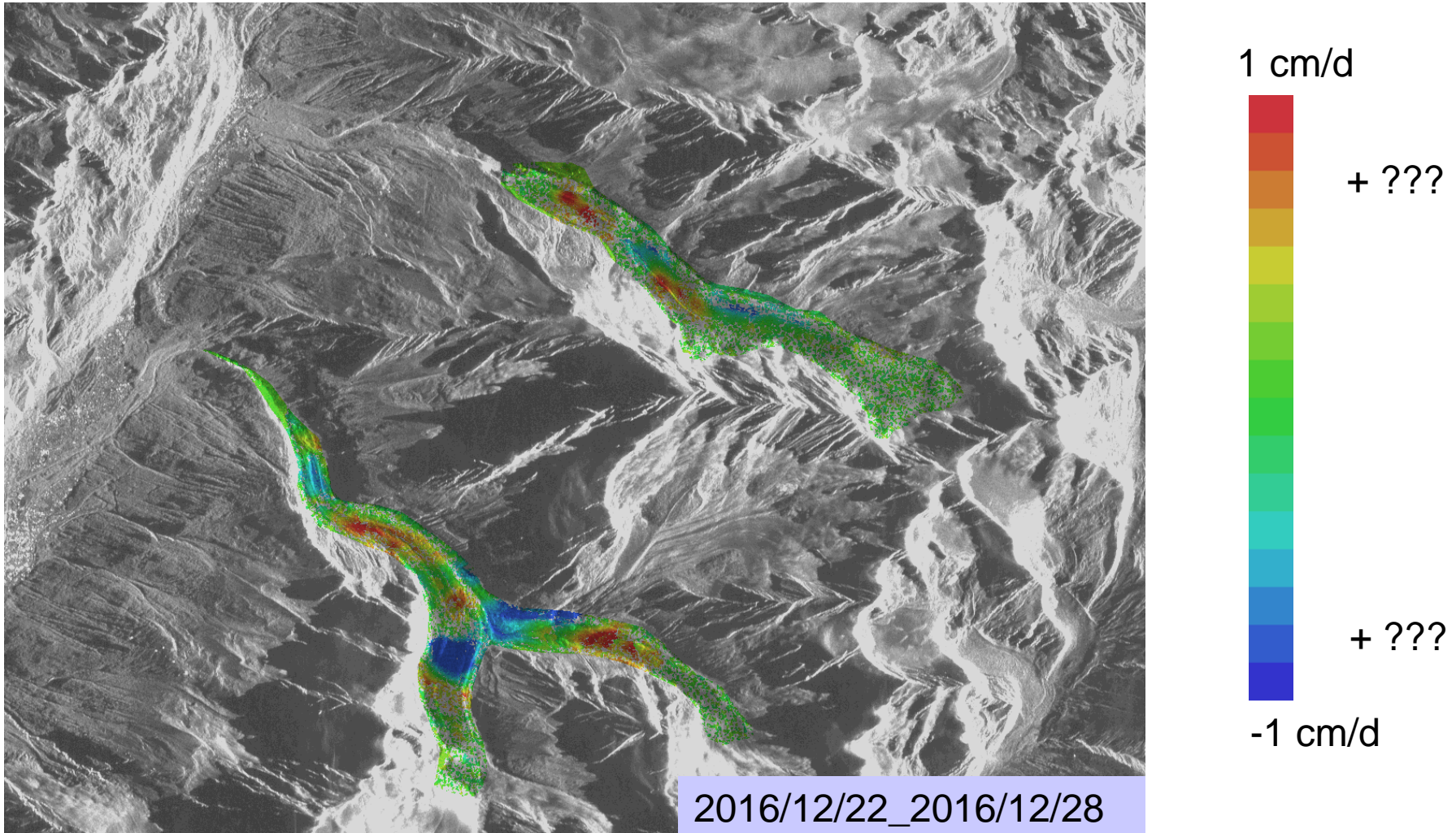
# Sentinel1-Ascending - Coherence




# Sentinel1-Ascending, LOS displacement



# Sentinel1-Descending, LOS displacement



# Overview

1. Surface displacement by differential interferometry
  - Potential and limits
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  - Results from ERS tandem data
2. 2D/3D surface displacement by offset tracking
  - Potential and limits
  - Processing steps
  - Results from TerraSAR-X stripmap images
3. Surface elevation by SAR interferometry
  - Potential and limits
  - Processing steps
  - Results from TanDEM-X data
4. How about Sentinel-1?
-  5. Perspectives

# Glacier monitoring by spaceborne SAR data

## ■ Displacement fields

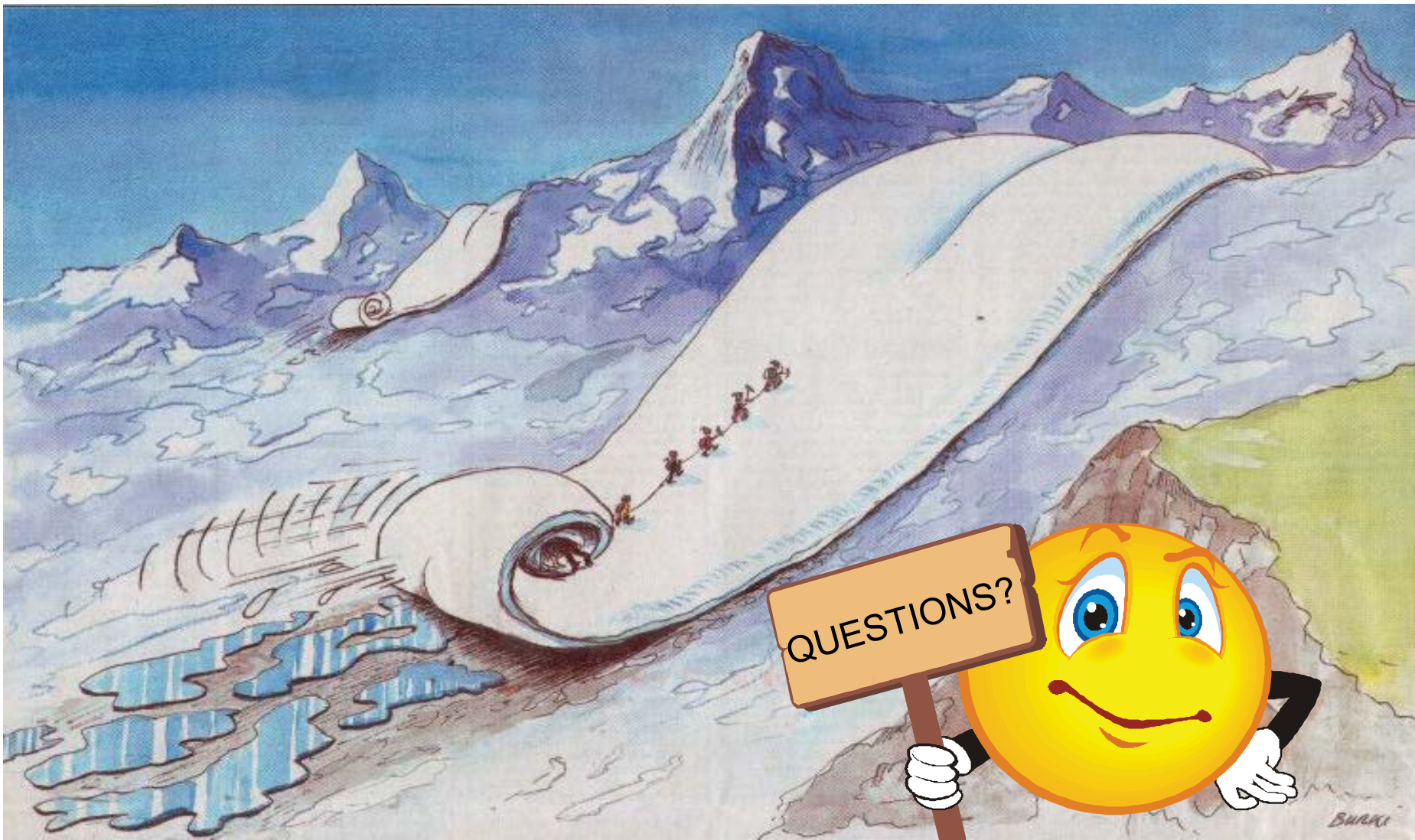
- InSAR: New opportunity with Sentinel-1 6-day interferograms
- Multi-interferogram: displacement signal / atmospheric perturbations
- Phase unwrapping: additional information to solve ambiguity
- Offset tracking with high resolution data → 2D/3D displacement
- Spatial and temporal complementarity of InSAR and offset tracking

## ■ Elevation changes

- TanDEM-X: uncertainty due to penetration increases with the altitude
- Use of pairs from the same period of the year

## ■ Surface/volume characteristics

- Full polarimetry: multivariate multitemporal data
- Snow / firn evolution, data assimilation with snow pack models
- BioMas (P band) → PolInSAR for snow/ice features retrieval ???



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