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# GEOS 657 – MICROWAVE REMOTE SENSING

## GRADUATE-LEVEL COURSE AT THE UNIVERSITY OF ALASKA FAIRBANKS

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### Lecturer:

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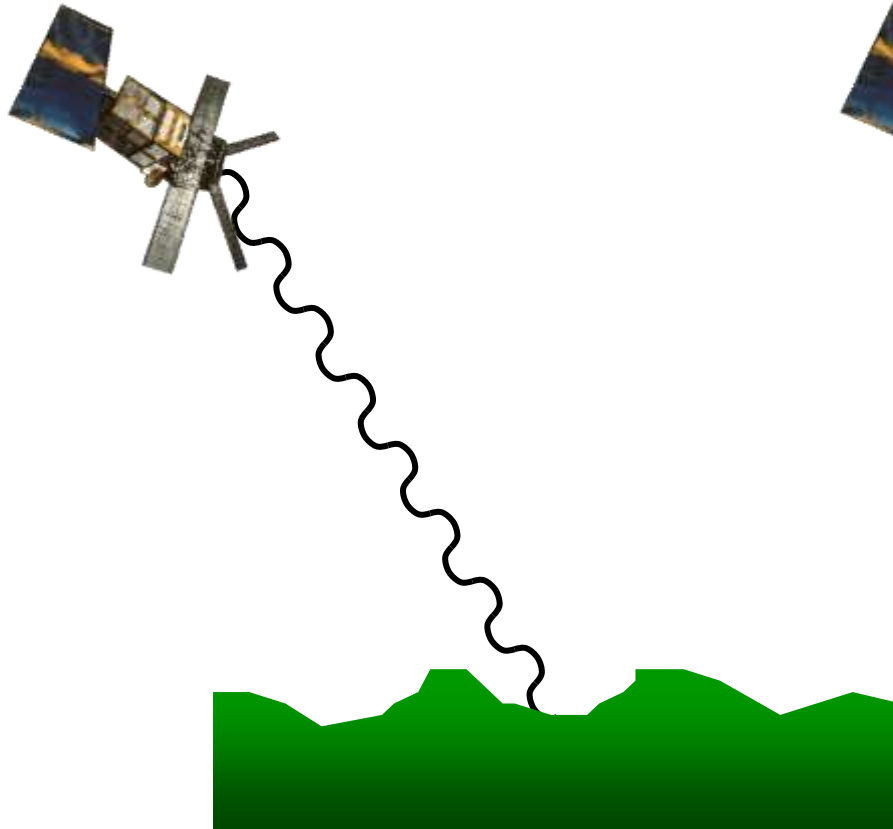
## Lecture 12: InSAR for Deformation Monitoring, Automatic Processing Services & Limitations of Traditional InSAR



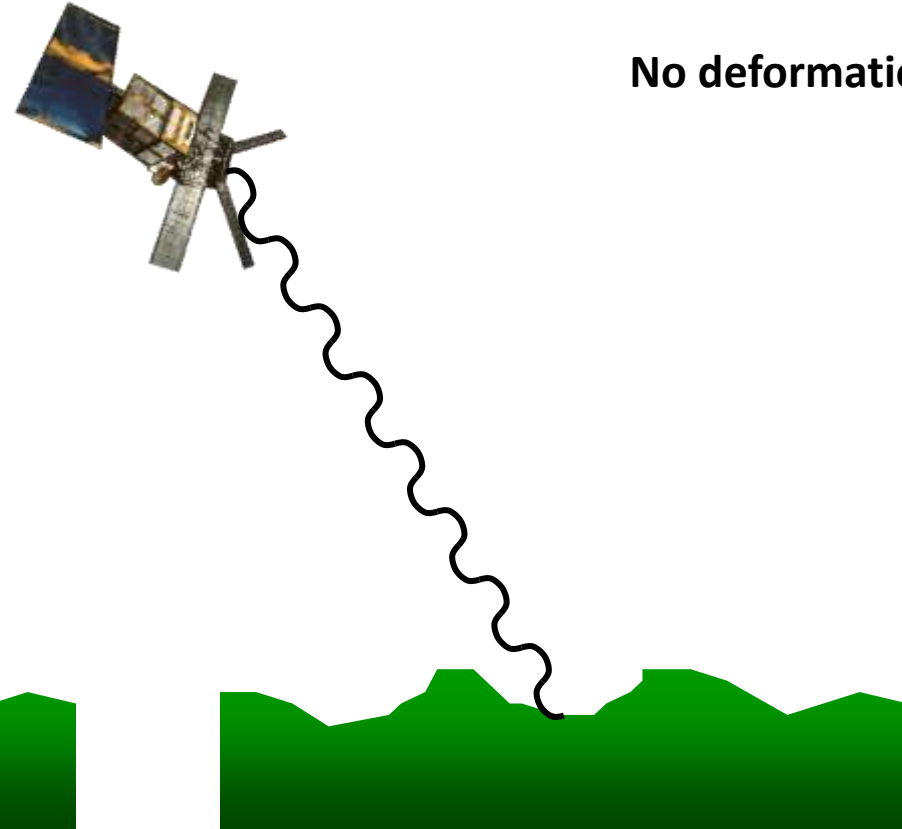
# How InSAR Works

- InSAR phase is a function of distance from satellite to ground (range)

**Pass 1**



**Pass 2**



**No phase shift**

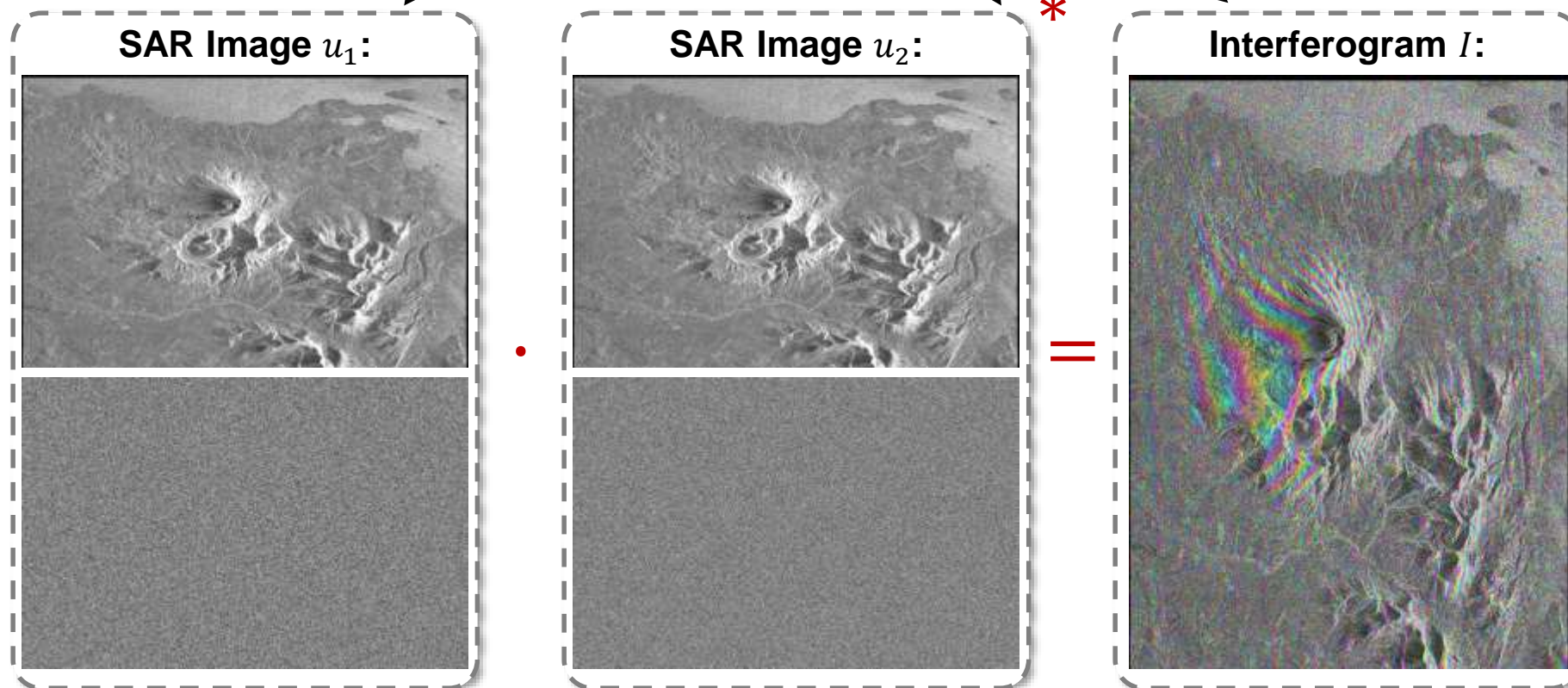
**No deformation**



# InSAR Processing – Steps 1 – 7:

## Find and Download Images, Co-Register & Form Interferogram

- To form interferogram, we calculate:  $I = u_1 \cdot u_2^*$  (where  $*$  = complex conjugate)



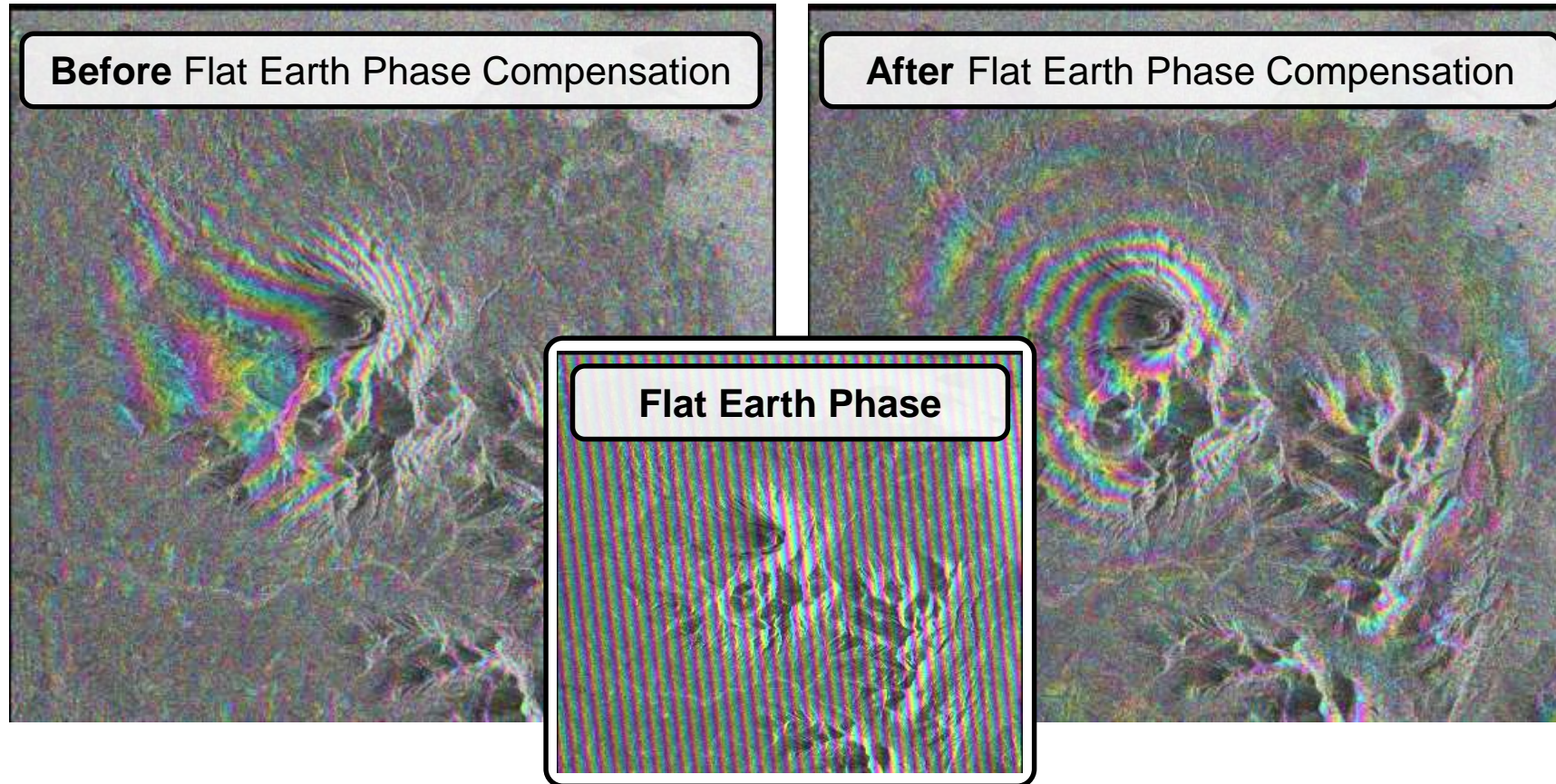
Example: Mt. Peulik volcano, Alaska

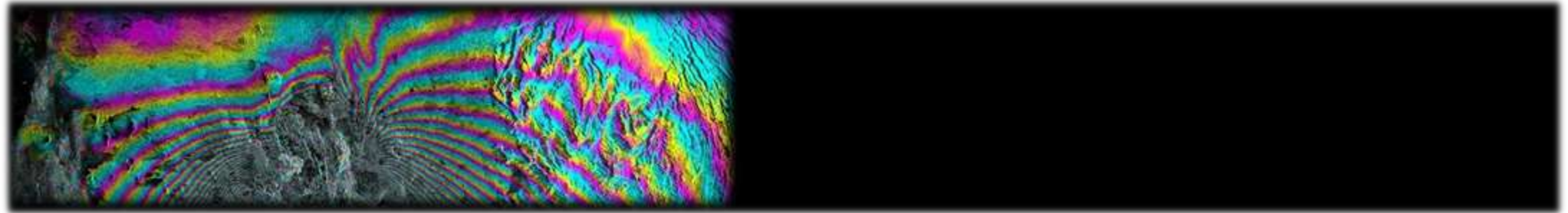


# InSAR Processing – Step 8:

## Subtraction of Flat Earth Phase

- **Example:**
  - ERS-2 Interferogram of Mt. Peulik volcano, Alaska

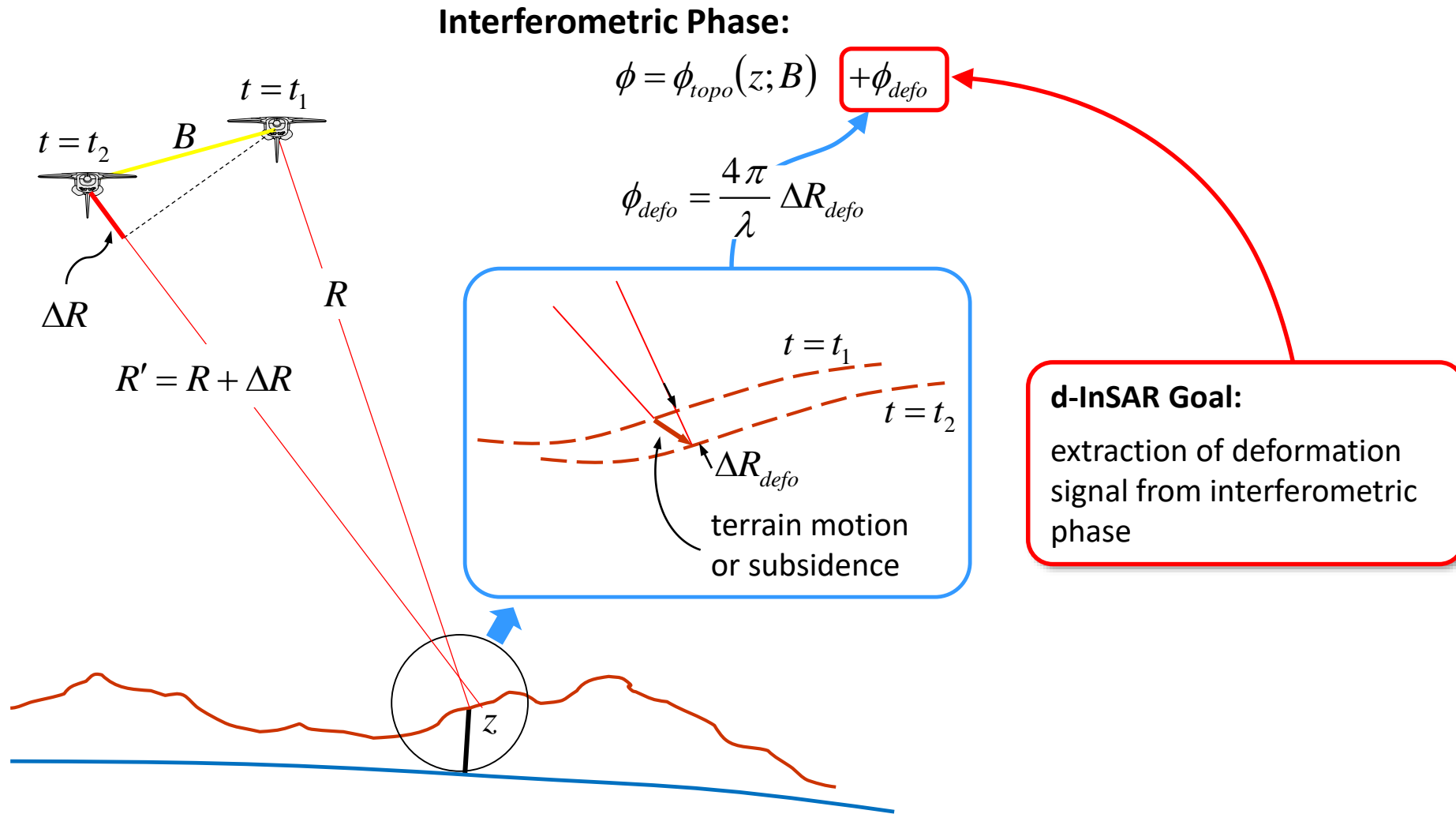




# DIFFERENTIAL INSAR – A METHOD FOR CM-SCALE DEFORMATION MONITORING



# The Concept of Differential InSAR (d-InSAR)



# How to Separate Topographic and Deformation Phase?

1. If reliable DEM is available, use DEM to compensate for topography.

2. Else,  $\geq 3$  complex SAR images at times  $t_1, t_2, \dots, t_n$  are required:

- Form several interferograms:

- time lag:

$$\Delta t_{n-m} = t_n - t_m$$

- baseline:

$$B_{\perp, n-m}$$

- phase:

$$\phi_{n-m}$$

**For signal separation consider:**

- Deformation phase changes only with time
- Topography phase changes only with Baseline

- For constant velocity:  $\phi_{n-m}^{defo} = \phi_{n-m} \propto \Delta t_{n-m}$  and  $\phi_{n-m}^{topo} = \phi_{n-m} \propto B_{\perp, n-m}$

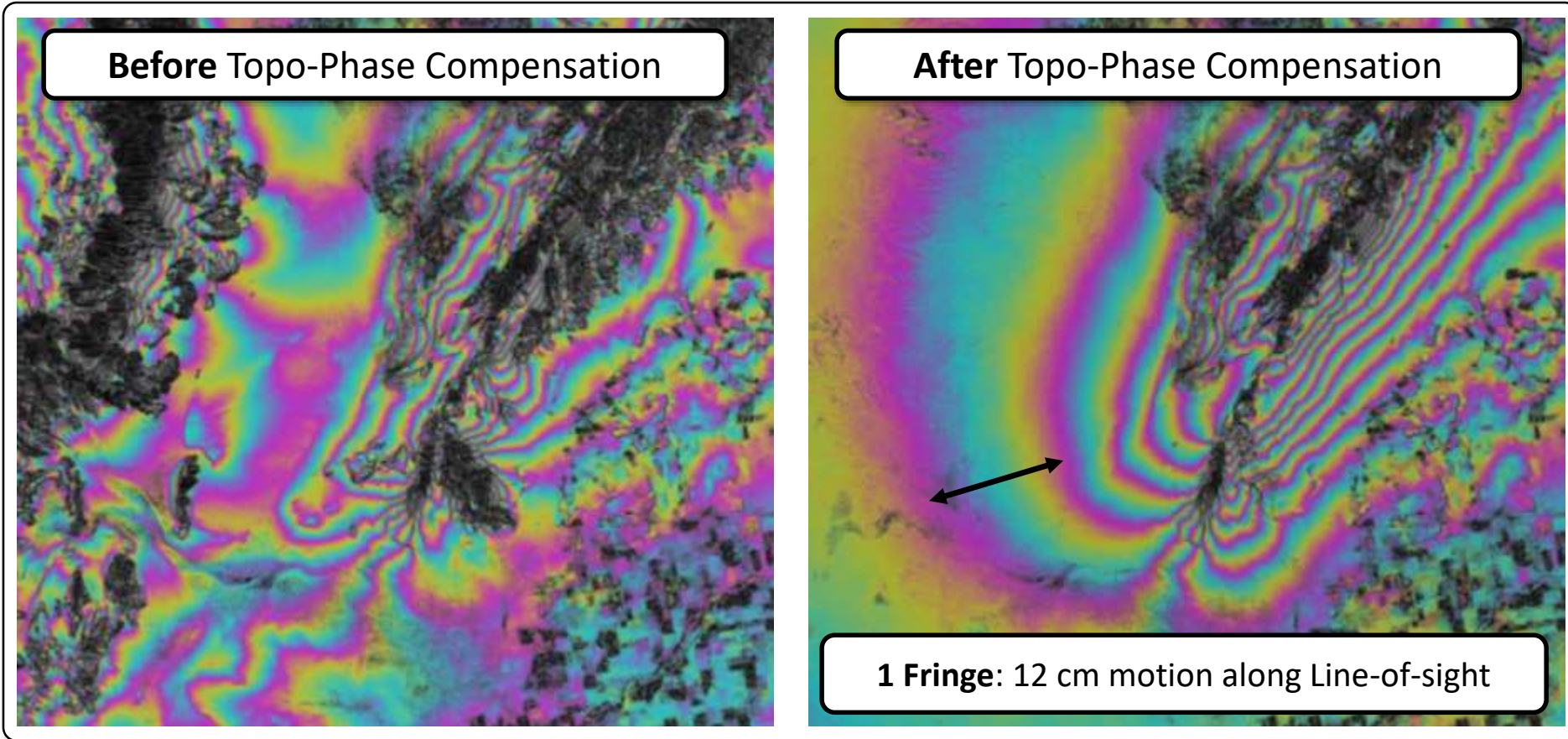
3. For singular displacement event: use  $\phi_{n-m} \propto B_{\perp, n-m}$  to derive topography





# Example of Topography Compensation

- Compensation using available DEM
- ALOS PALSAR data of Baja Earthquake, 2010

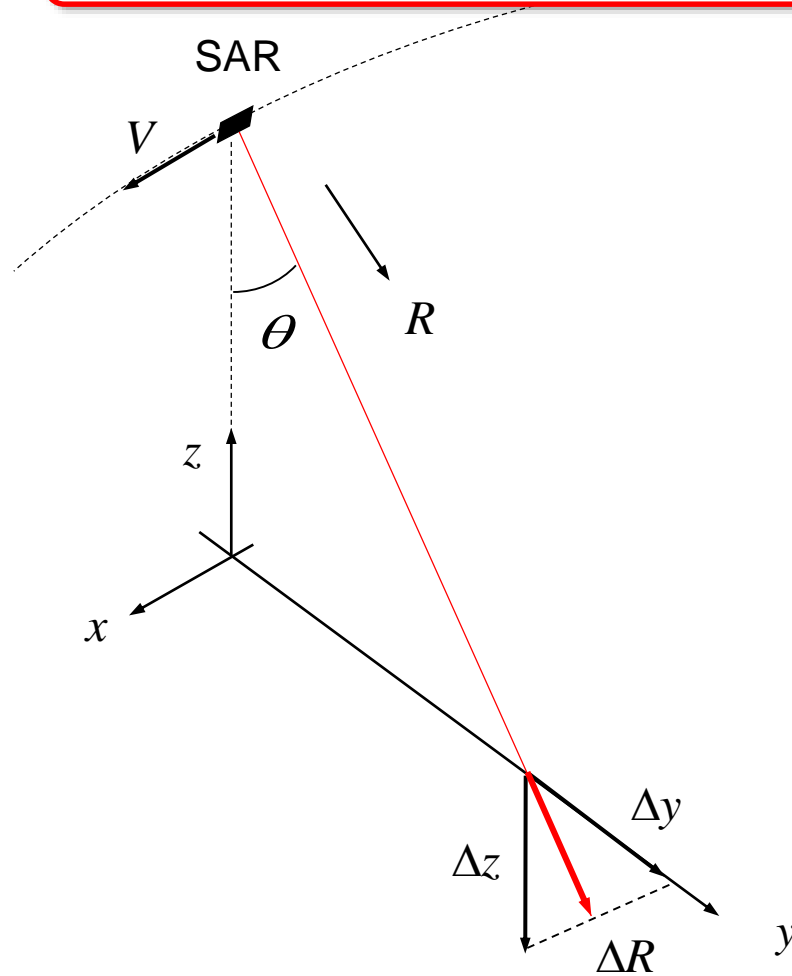




# How well can we measure deformation?

How to measure surface motion from the InSAR phase:

$$\phi_{defo} = \frac{4\pi}{\lambda} \Delta R_{defo}$$



$\Delta R$  is motion in sensor look direction

$$\Delta R = \Delta y \sin \theta - \Delta z \cos \theta$$

For previous PALSAR example:

1 fringe ( $2\pi$ ) corresponds to

12.5 cm in R

14.5 cm in z (e.g. subsidence)

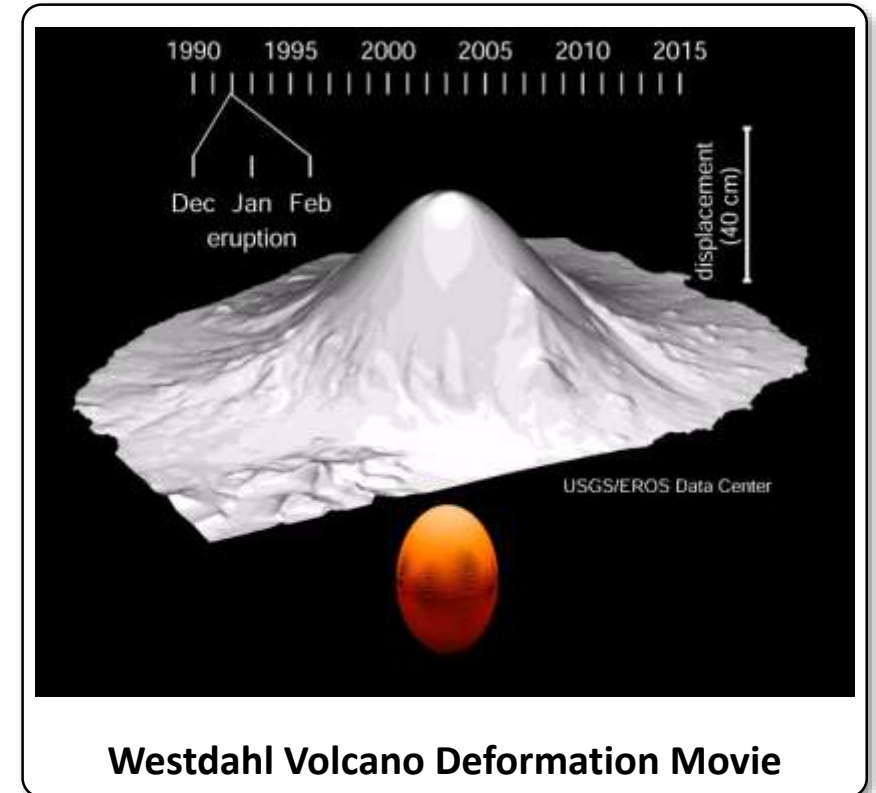
25.0 cm in y (motion)



# Monitoring Volcanoes with InSAR

## Principle

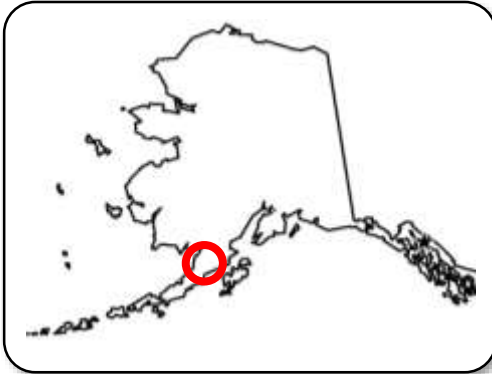
- InSAR is capable of observing inflation and deflation of volcanoes
- Inflation and deflation is triggered by changes of magma pressure in magma chamber (see animation)
- These phenomena precede volcanic eruptions and are potentially interesting for predicting eruptive behavior



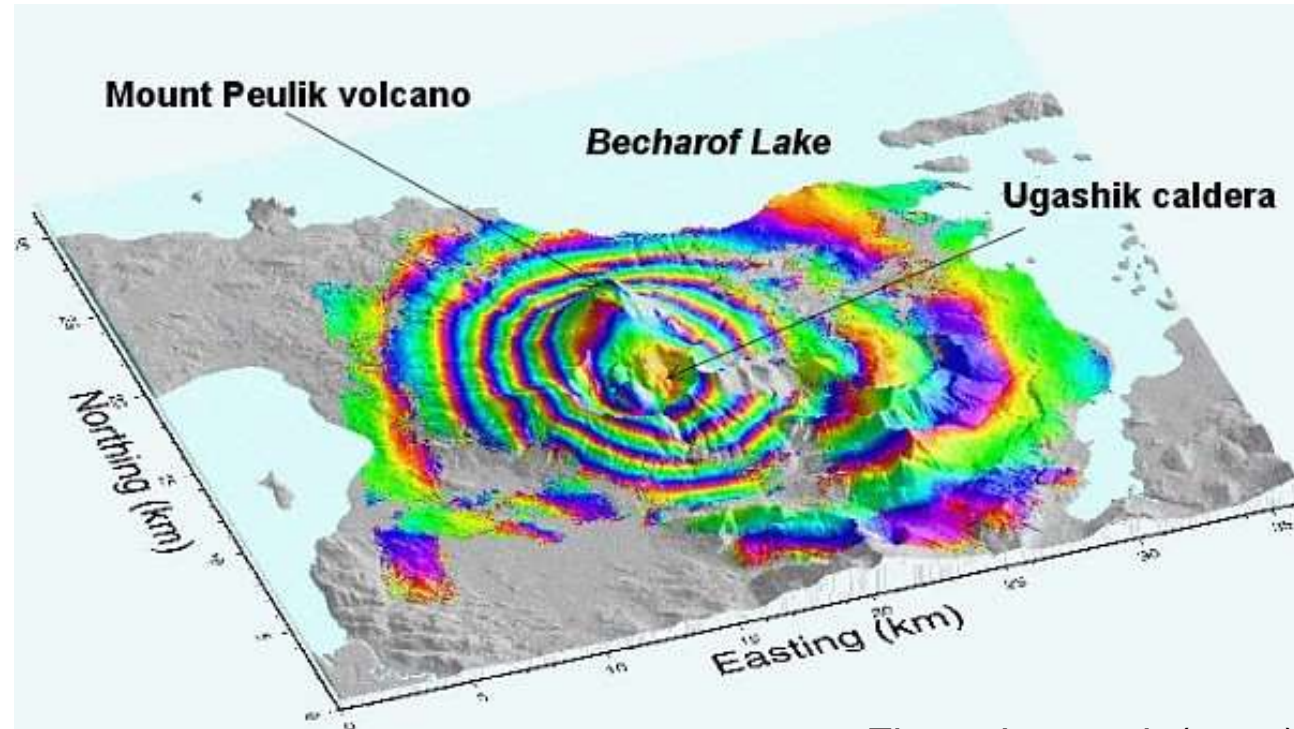


# Interferometric Phase Interpretation

## Example: Surface Deformation at Mt. Peulik, Alaska



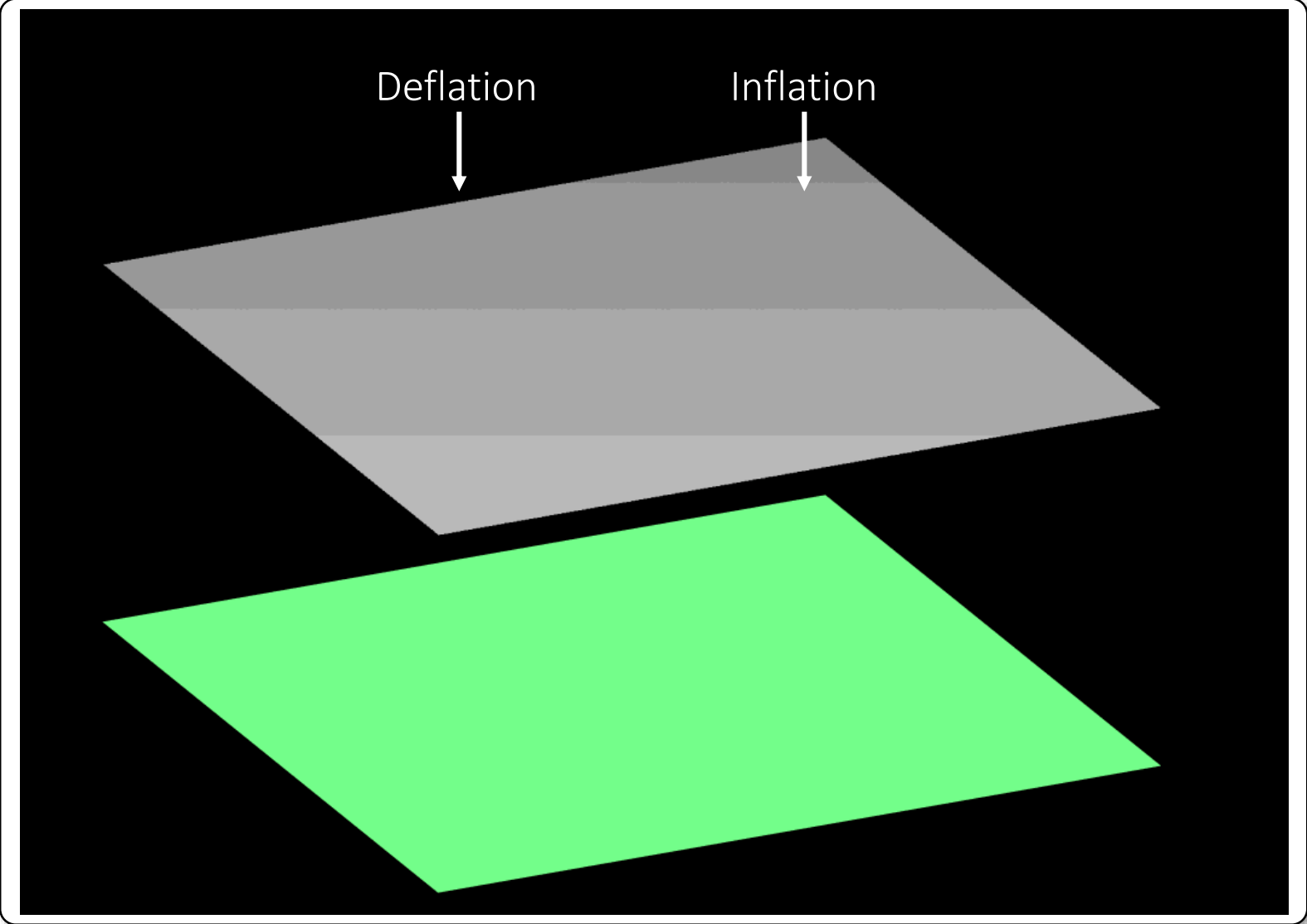
17-cm inflation, Sept. 1996 to Oct. 1997



Zhong Lu, et al. (2001)



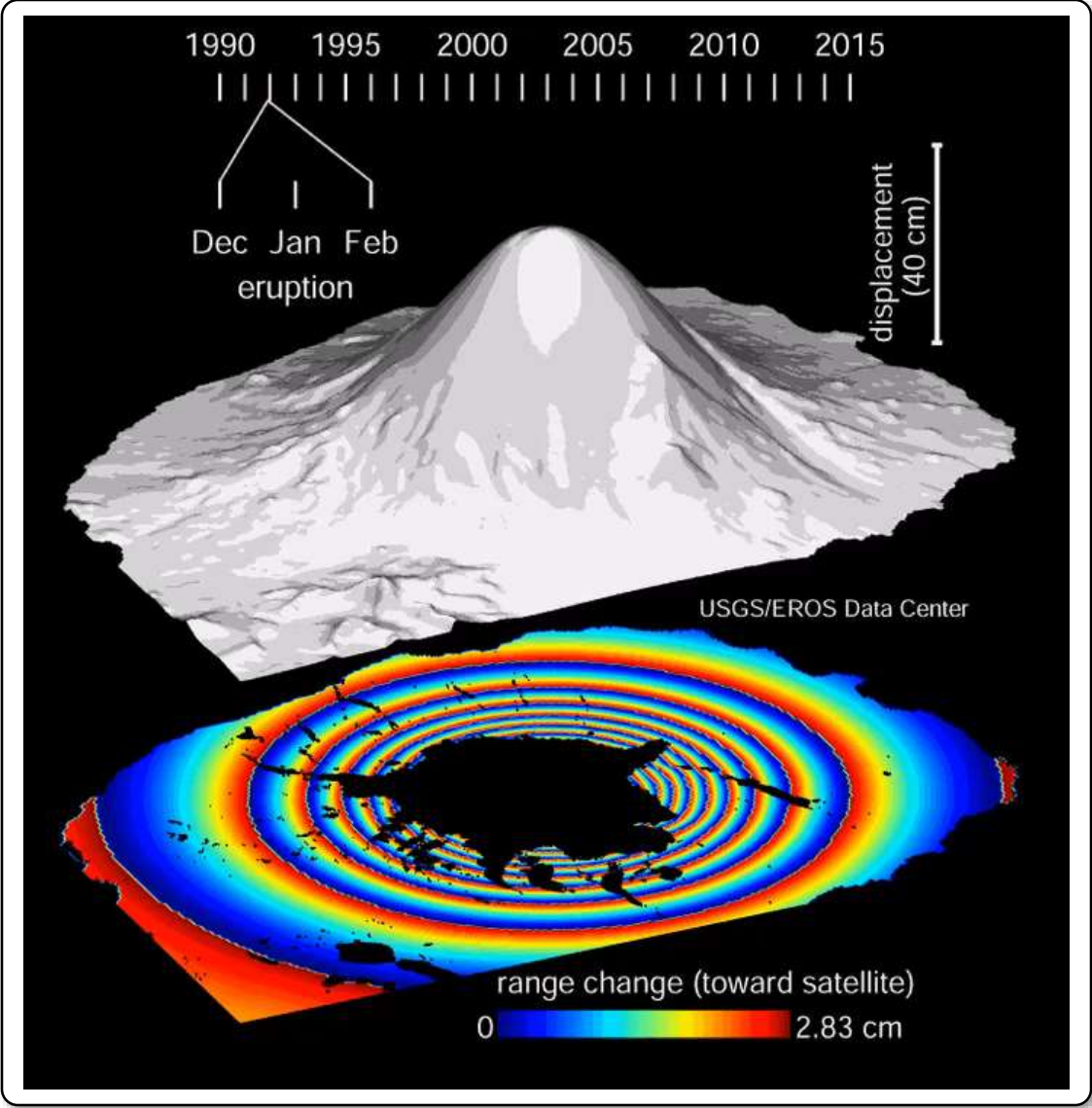
# Representation of Interferometric Phase



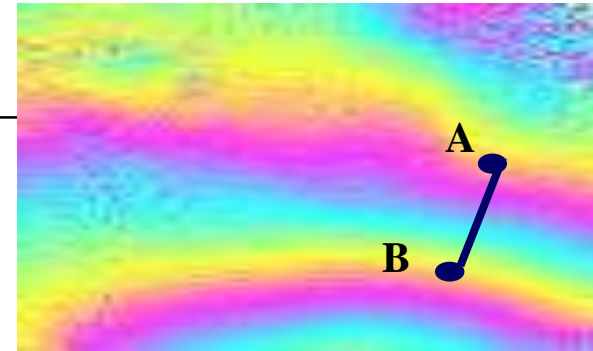


# Representation of Interferometric Phase

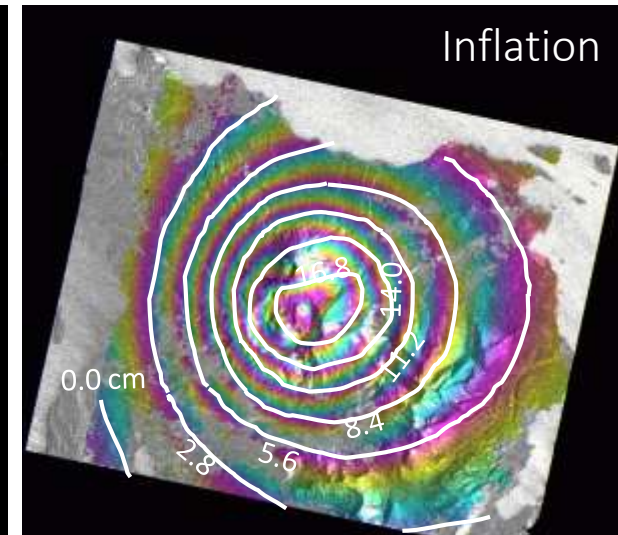
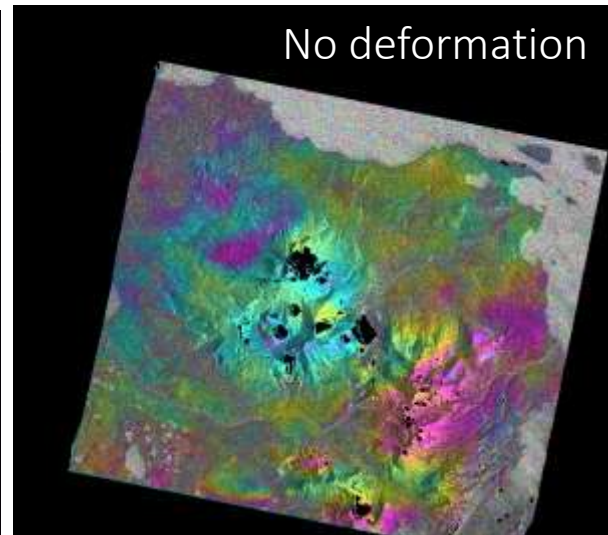
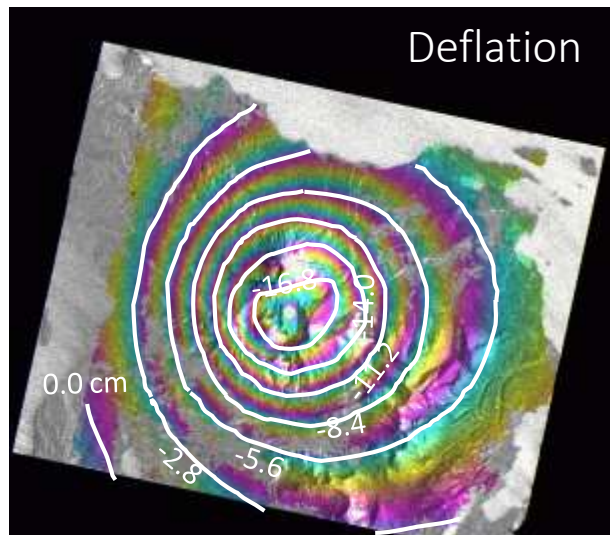
## The Westdahl Case



# Interpretation of Interferometric Phase



- Phase Difference from A to B:  $-2\pi$  (one fringe)
- Deformation: B inflates 2.83 cm relative to A.



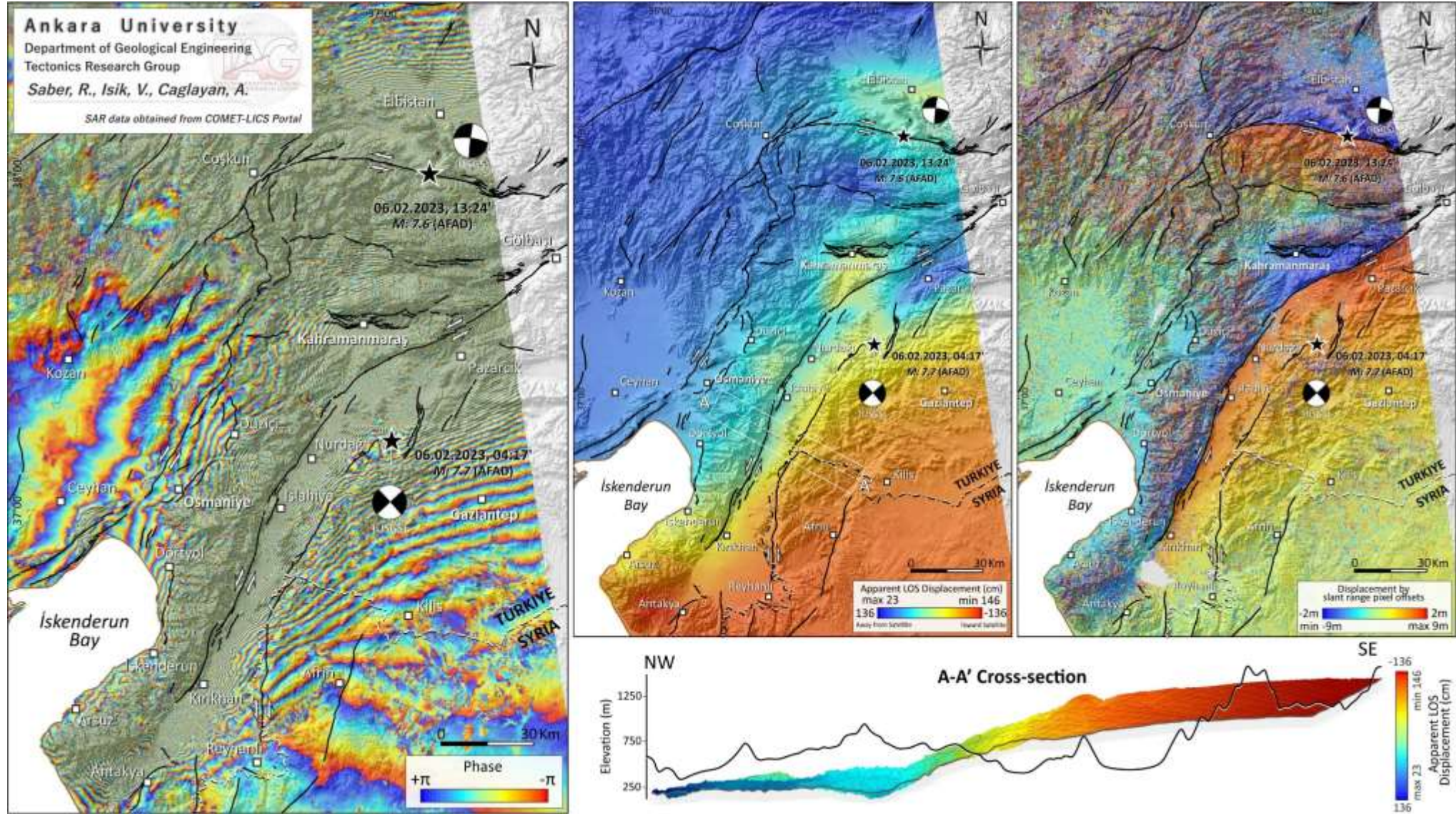
Dr. Z. Lu, USGS



# Interferograms in Support of Emergency Management

## Example: 2023 M7.8 Turkey–Syria Earthquake

Modern SAR Sensors such as Sentinel-1 and the upcoming NISAR mission can provide InSAR data within 2-3 days of an event

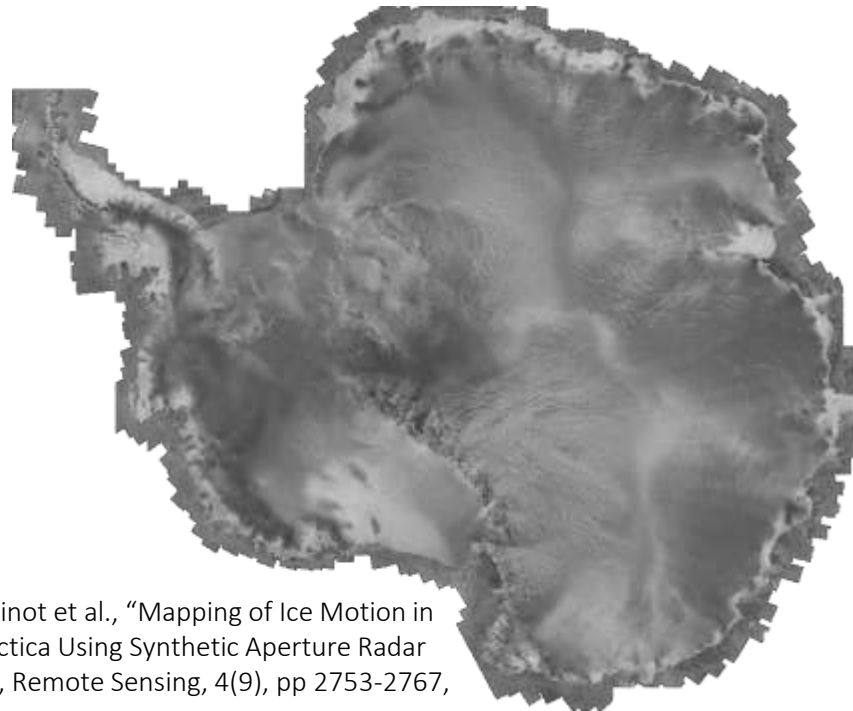
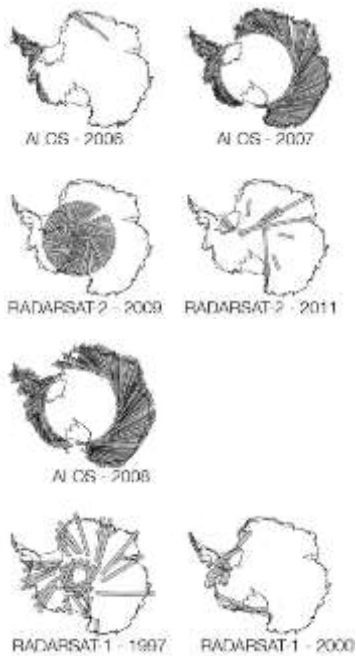




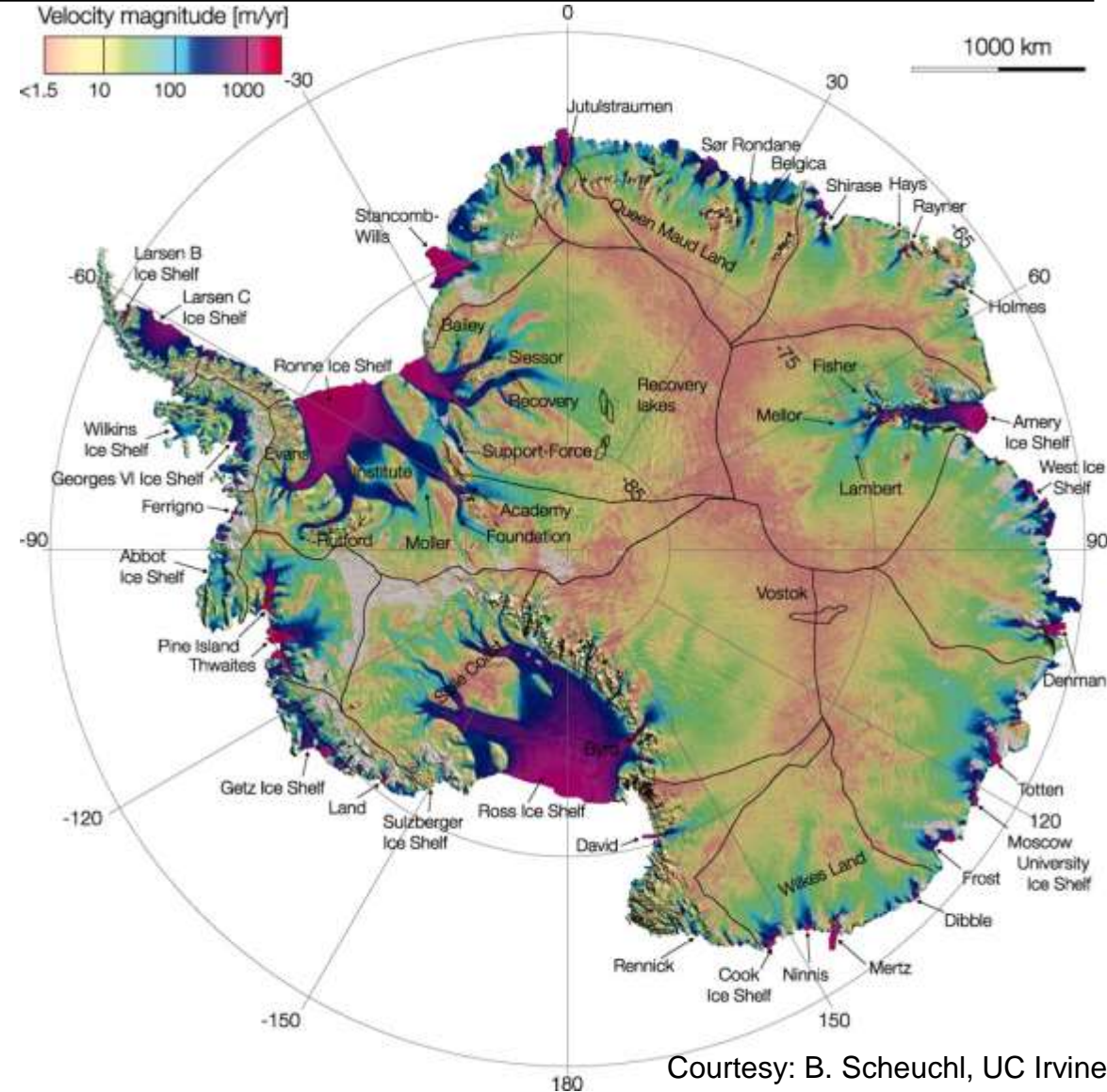
# Continent-Wide Deformation Mapping from InSAR

## Example: Antarctica

- First Antarctic-wide glacier velocity map in history
- Full coverage by merging data from a wide range of satellite systems
- Accuracy varies with number of multiple coverage per area and coherence



Mouginot et al., "Mapping of Ice Motion in Antarctica Using Synthetic Aperture Radar Data", Remote Sensing, 4(9), pp 2753-2767, 2012



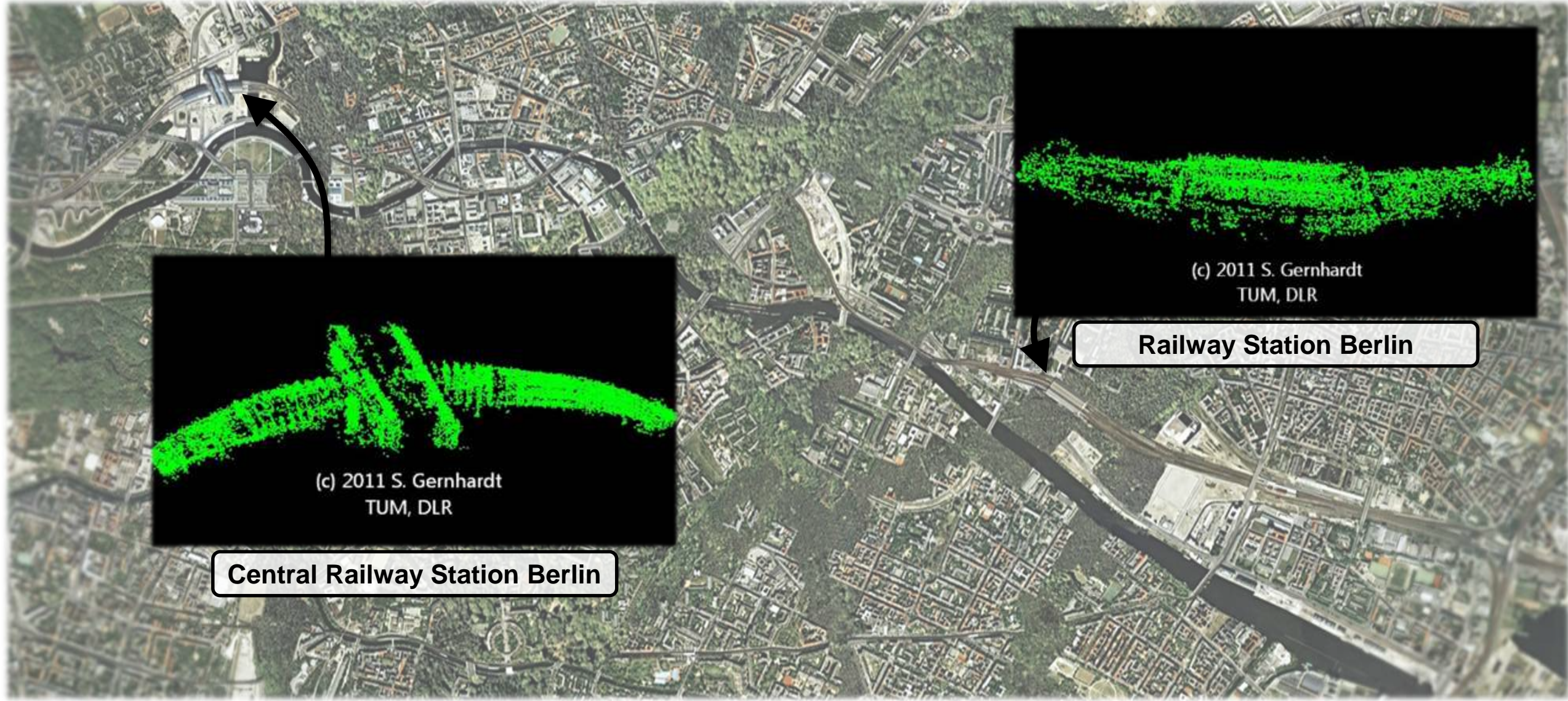
Courtesy: B. Scheuchl, UC Irvine





# Sub-Milimeter Surface Analysis

## Building Deformation in Berlin, Germany





# Typical Applications of Differential InSAR

## Application

- Infrastructure (buildings; roads; levees) deformation
- Sink holes
- Landslides
- Oil/gas extraction
- Glacier motion mapping
- Volcano monitoring
- Permafrost-related surface deformation
- Soil moisture variation
- Co-seismic earthquake deformation
- Post & inter-seismic deformation
- Ice sheet monitoring

## Notes

- X-band
- X-band
- X- or C-band
- C- or L-band
- L-band
- L-band
- L-band
- C- or L-band



# Think – Pair – Share



## Picking the right data for your InSAR analysis:

- Okmok is a volcano in Alaska's Aleutian Chain.
- Since its last eruption in 2008, the volcano has been re-inflating at a rate of  $\sim 10\text{cm/year}$

• **Activity:** Pick the most suitable interferogram for measuring this deformation. Motivate your answer!

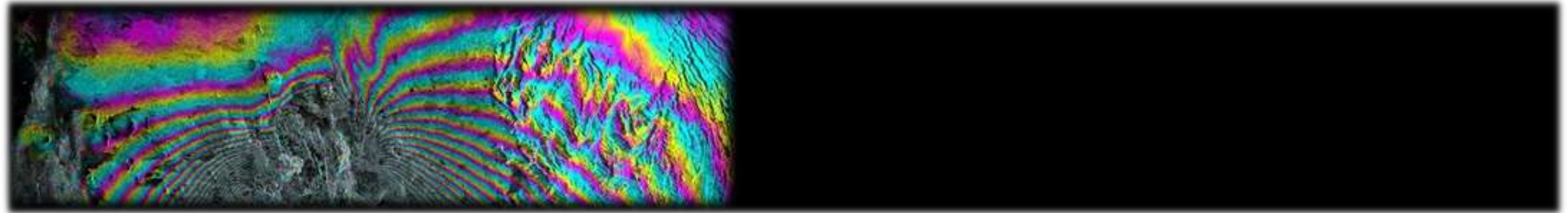
- L-band data;  $\Delta t = 24$  days; June - July
  - L-band data;  $\Delta t = 48$  days; June - August
  - L-band data;  $\Delta t = 144$  days; July – December
  - C-band data;  $\Delta t = 24$  days; June - July
  - C-band data;  $\Delta t = 48$  days; June - August
  - C-band data;  $\Delta t = 144$  days; July - December
- Please consider the expected coherence  $\gamma$  and phase noise  $\sigma_\phi$  in your answer



Okmok Volcano, Alaska







## TYPICAL INSAR PROCESSING WORKFLOW



# A Typical InSAR Processing Workflow

1. **Select and order InSAR-capable SAR data** from a data server
2. **Import SAR data into an InSAR processing system**
3. **Calculate spatial baseline & apply spectral (wavenumber) shift filtering** (not discussed in the lectures – applied automatically by most available tools)
4. **Determine co-registration parameters:**
  - cross-correlate >100 image chips spread over image
  - use over-sampling and interpolation to locate correlation peaks
  - apply regression to parameterize co-registration (e.g. affine transform)
5. **Co-register images:**
  - Resample slave image(s) to match master image
  - Required accuracy:  $\ll 1/10$  resolution element
  - **More on required co-registration accuracy on Slides 20 & 21**



# A Typical InSAR Processing Workflow

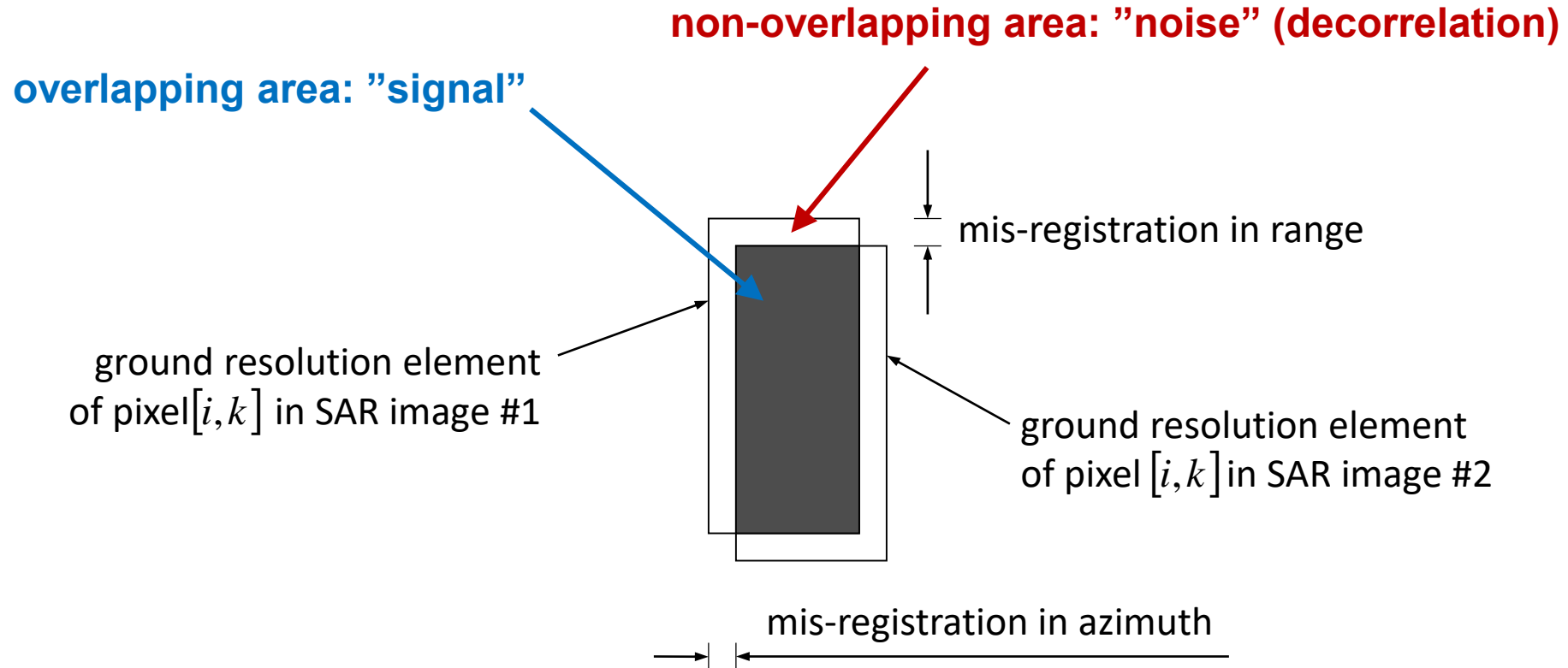
6. [Optional Orbit improvement: If precise orbit information is available.]
7. **Interferogram formation:**  $I = u_1 \cdot u_2^*$ ; optional multi-looking may be applied.
8. **Flat Earth phase removal:** Simulate and subtract phase trend due to the geometry changes from near range to far range.
9. **Coherence Calculation:** Coherence is calculated as described in Lecture 12.
10. **For differential InSAR (d-InSAR):** Using a DEM, simulate and subtract interferogram replicating topography-related phase.
11. **Apply phase filter:** A phase filter is applied to reduce InSAR phase noise and reduce phase unwrapping complexity (see next section).
12. **Phase Unwrapping:** Turns originally ambiguous interferometric phase into unambiguous absolute phase.
13. **Geocoding and Terrain Correction:** Note that flat earth phase needs to be added before geocoding to obtain absolute phase.





# Effects of Coregistration Errors on Coherence

- How accurately must the two SAR images be co-registered before interferogram formation?

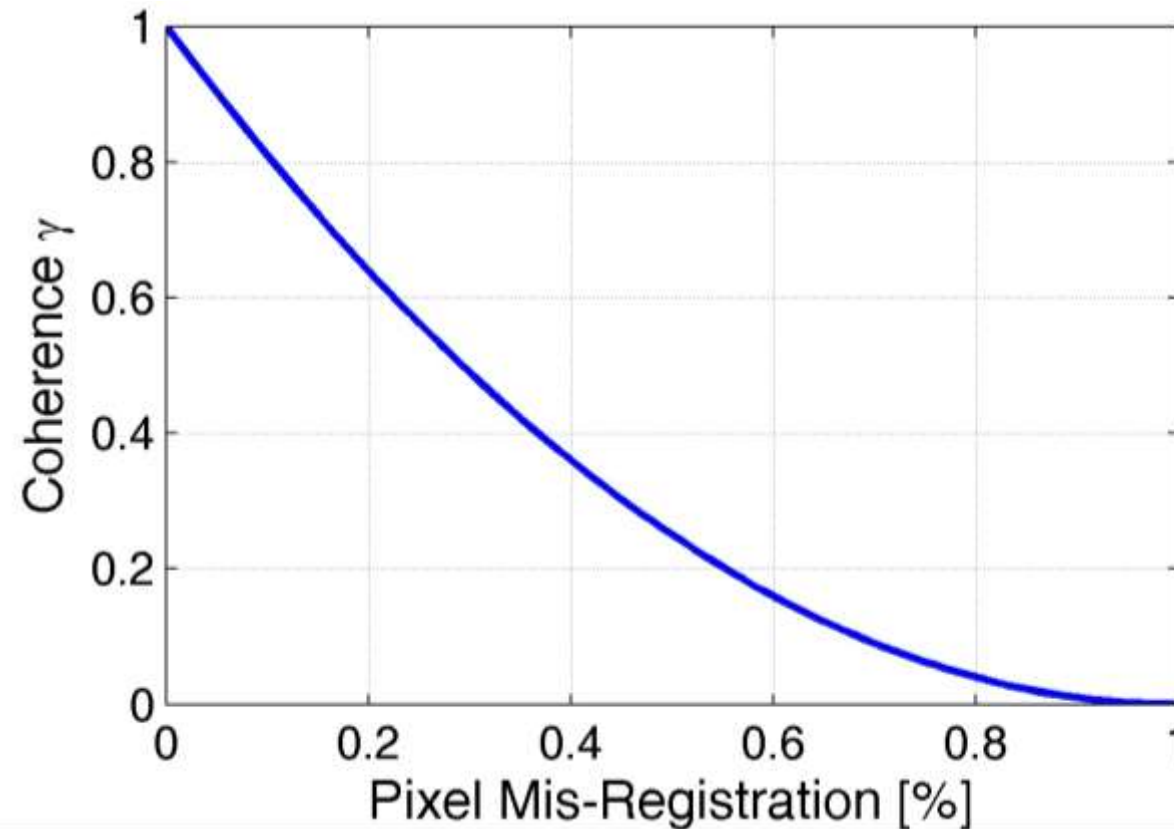


**Stripmap rule-of-thumb:** 1/10 of a resolution element mis-registration is usually acceptable



# Coherence Reduction Caused by Image Mis-Registration

- Here a plot how coherence drops with pixel misregistration:
  - **Assumption:** Mis-registration is only cause of de-correlation
  - Mis-registration expressed in fractions of pixels



## How to select a suitable image pair for successful InSAR processing

- **Required conditions:**

- Images from identical orbit direction (both ascending or both descending)
- Images with identical incidence angle and beam mode
- Images with identical resolution and wavelength (usually: same sensor)
- Images with same viewing geometry (same track/frame combination)

- **Recommended conditions:**

- For topographic mapping: Limited time separation between images (temporal baseline)
- For deformation mapping: Limited spatial separation of acquisition locations (spatial baseline)
- Images from similar seasons / growth / weather conditions







# AUTOMATIC (INSAR) PROCESSING SERVICES



# Why Is There a Need For Automatic SAR Processing Services?

- **Processing Flows for Generating Value-Added Products Are Often Complicated**
  - Difficult and heterogeneous data types and data formats
  - SAR data typically do not come geocoded and have strong geometric distortions
  - Strong noise effects require complex filtering approaches
  - InSAR processing is complicated and error prone
- **Large Data Volume of SAR Requires Powerful Processing Machines**
- **SAR Processing Software is Often Not User Friendly**

→ Several automatic processing tools are in development to make SAR data more accessible especially to new users from the disaster monitoring communities



# Search and Process (In)SAR Data with Vertex



**ASF Data Search Vertex**

Search Type: Geographic Search | Dataset: Sentinel-1 | Filters: ... | 250 of 15,928,271 Files | On Demand

Map View | Zoom: + - | Layers | Area of Interest | Opacity: 100%

lat 00.0° | lon 00.0°

- **Search & discover** ASF's holdings over your AOI
- Use our baseline and SBAS tools to **configure your perfect InSAR stack**
- Submit Sentinel-1 scenes for **on-demand processing** to RTC or InSAR
- **Download** data for additional processing using convenient interface options



## HyP3: On-demand processing service for analysis-ready SAR data

- Available to anyone at no direct cost
- DAAC managed L1 → L2 workflows

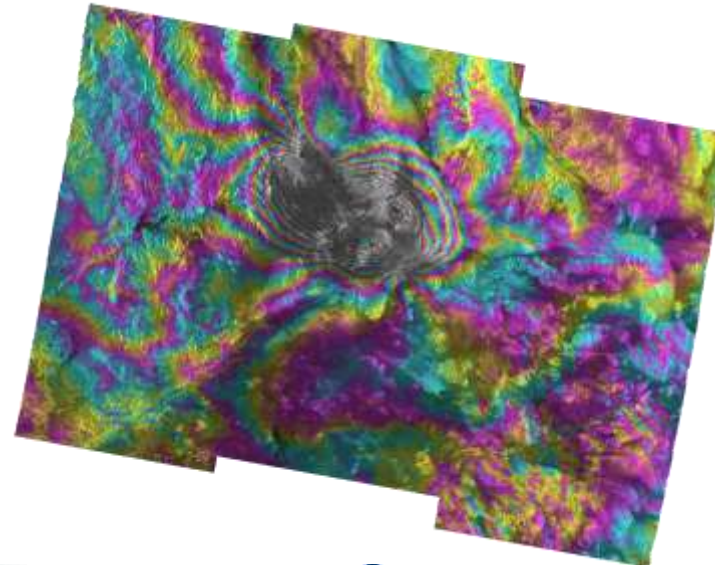
## RTC

- Radiometric Terrain Correction
- Corrects geometric and radiometric distortions caused by the terrain



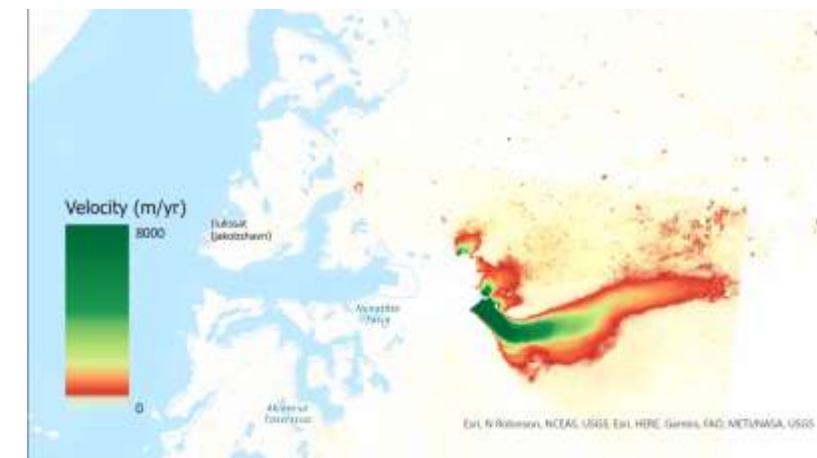
## InSAR

- SAR Interferometry
- The phase measurements of 2 SAR images are differenced to detect & quantify surface motion



## autoRIFT

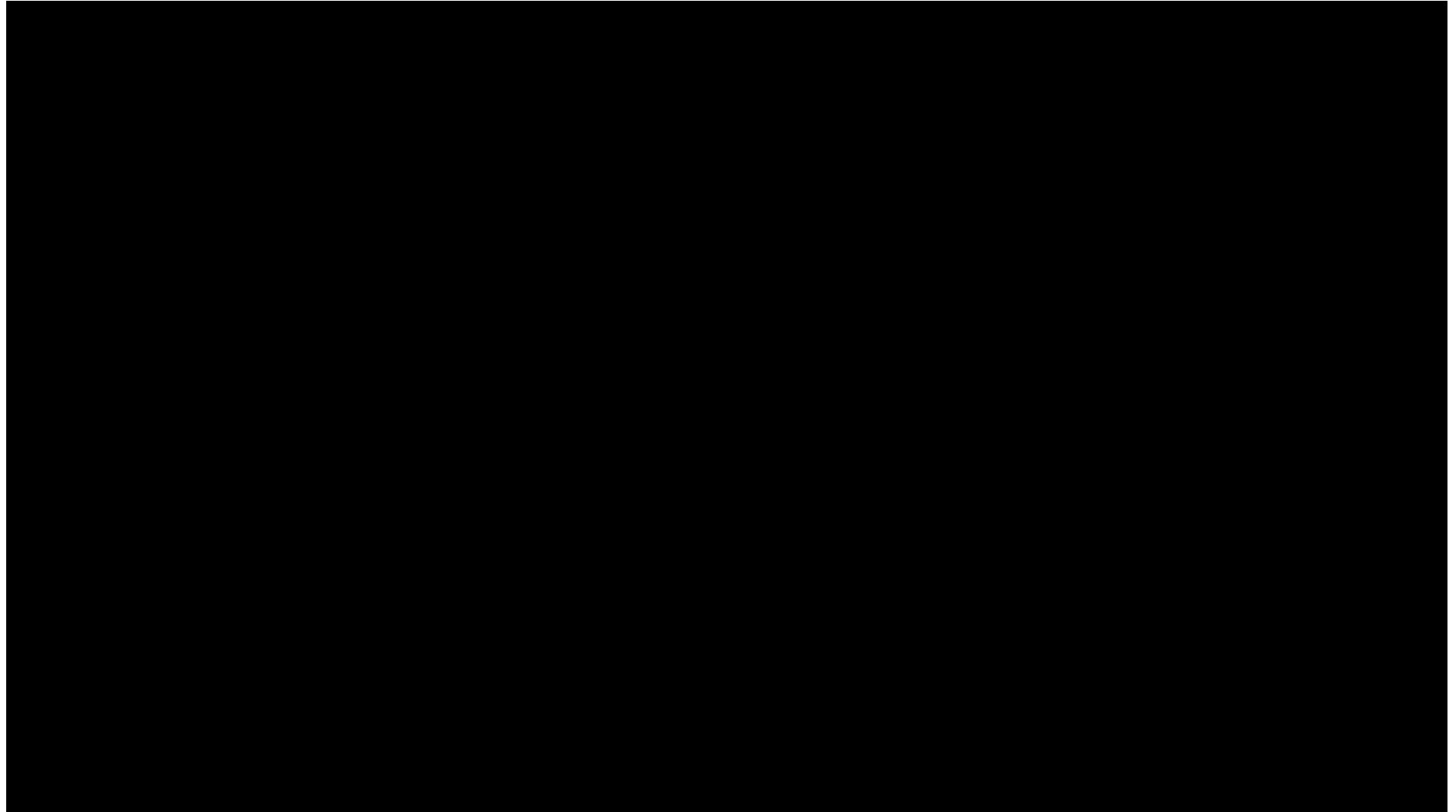
- Glacier velocity tracking
- Measures surface displacements between two SAR images
- Part of NASA MEaSUREs [ITS LIVE](#) project



# Order an SBAS InSAR Stack in Vertex and Analyze it in OpenSARLab

A demo on how to generate an SBAS InSAR Stack in Vertex and then Analyze the data using MintPy in OpenSARLab can be found here:

<https://youtu.be/tq8nZpsWK6k>



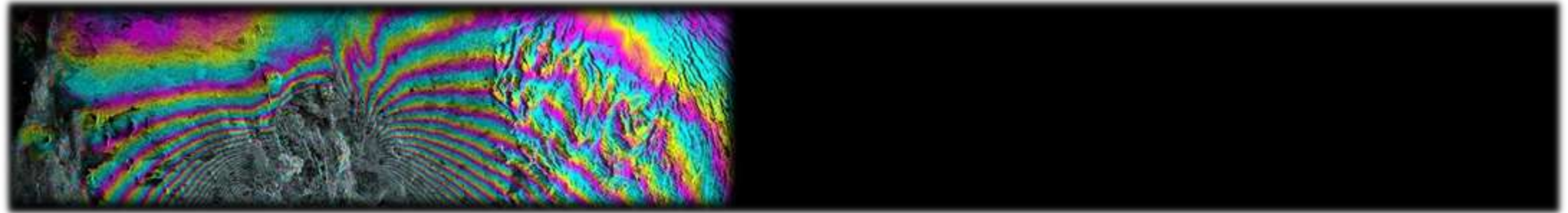


# Creating Product Subscriptions over your AOI on HyP3

## Example of a Sentinel-1 SAR Image Time Series:

- Mekong River Delta
- Time frame: 2019





## LIMITATIONS OF CONVENTIONAL INSAR



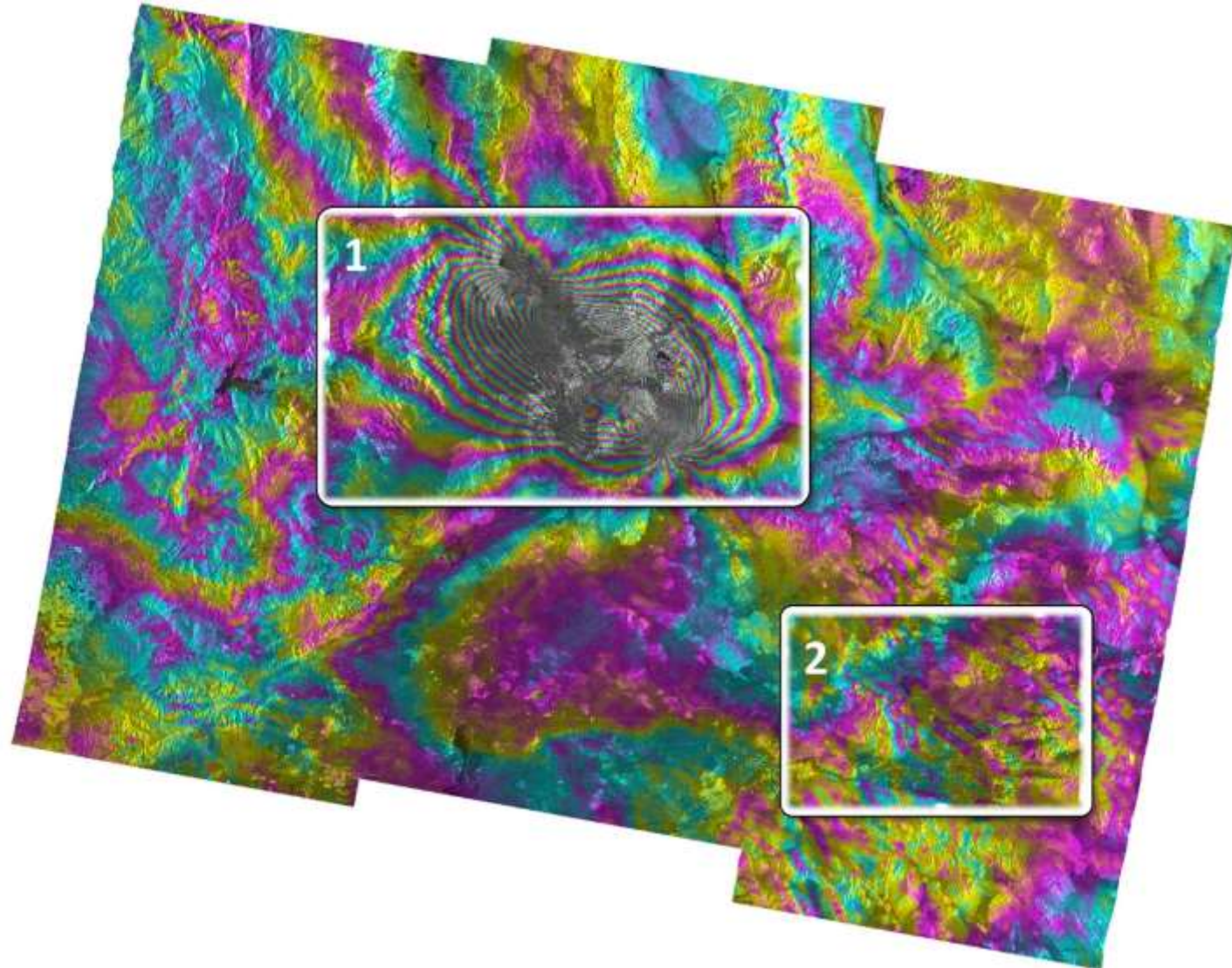


# Think – Pair – Share: Take 1



## Phase Interpretation: Analyze the phase content of this interferogram

- **Activity 1:** What do the phase patterns in Area 1 represent?
  - a) Displacement phase most likely related to an earthquake
  - b) Topographic signal
  - c) Atmospheric delay
- **Activity 2:** What is the main phase contribution in Area 2?
  - a) Displacement phase most likely related to an earthquake
  - b) Topographic signal
  - c) Atmospheric delay





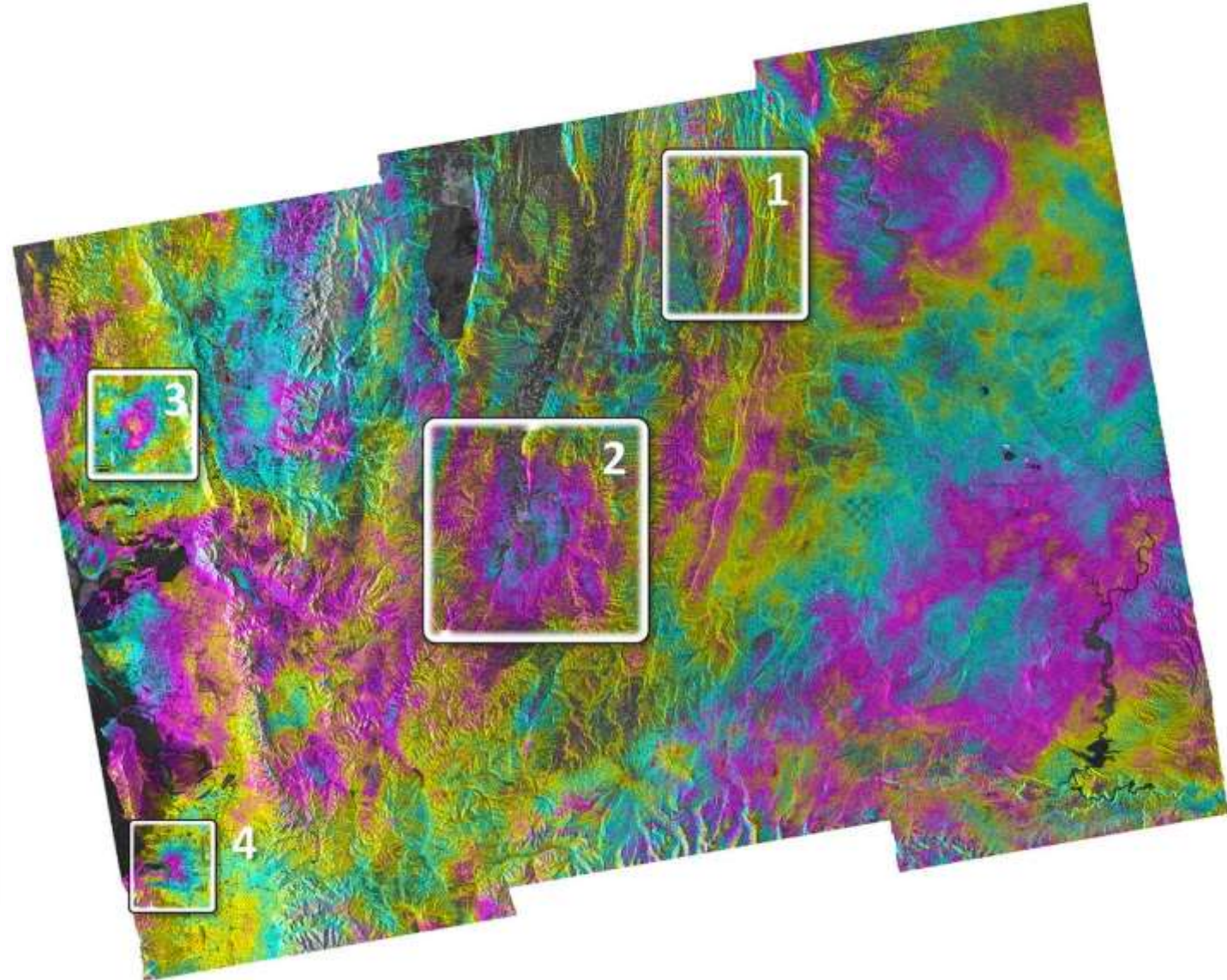
# Think – Pair – Share: Take 2



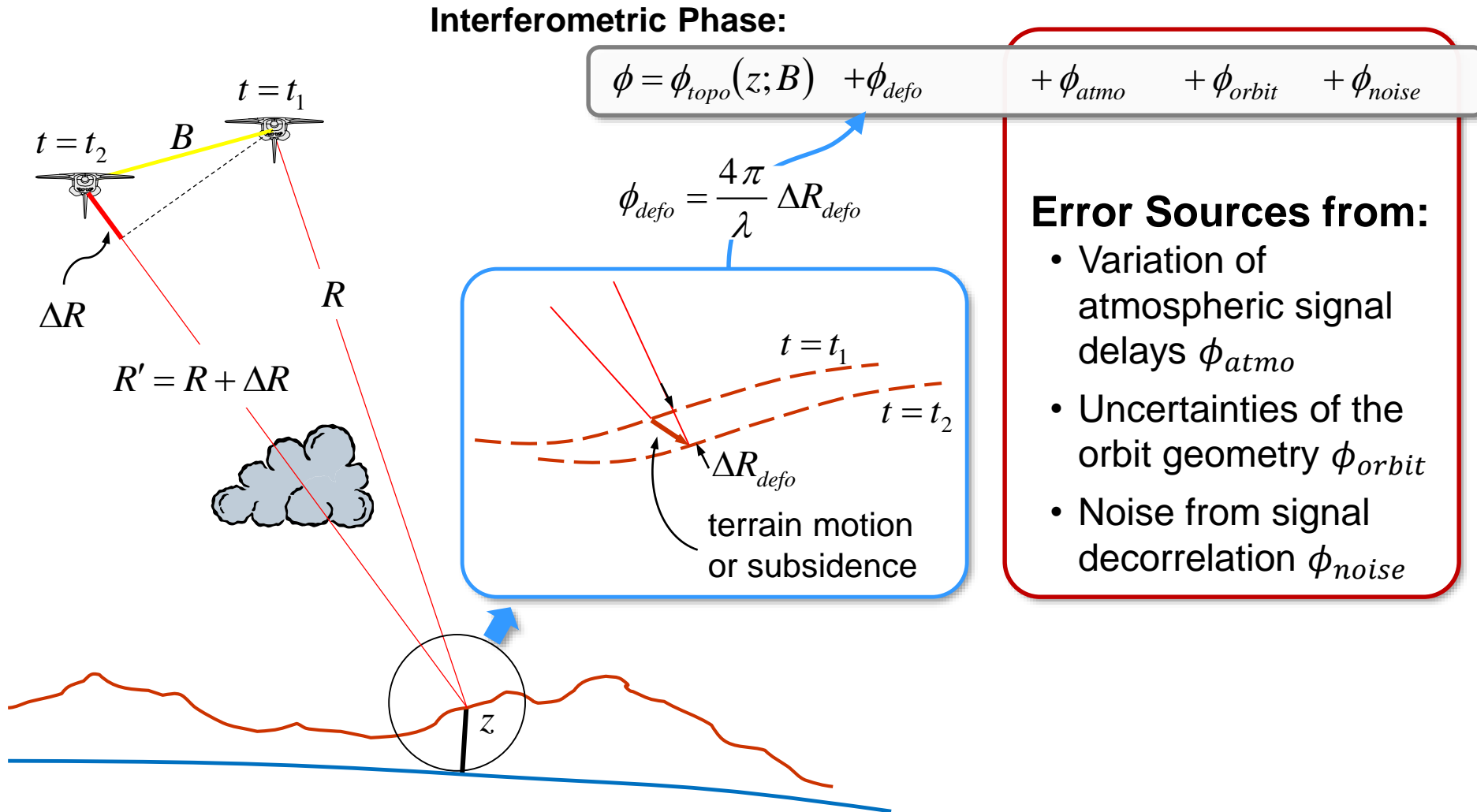
## Spot the Deformation Signal

The interferogram shown here contains a deformation signal related to a M5.7 earthquake. Despite its magnitude, the surface expression of this earthquake is rather small, making it very difficult to spot the location of the event against the noise background in the interferogram.

- **Activity:** Look at the four suggested locations above. Which of the four do you think shows the earthquake?
  - Area 1
  - Area 2
  - Area 3
  - Area 4



# Recap of InSAR Acquisition Scenario



# The Complete InSAR Phase Equation

- Phase of an interferogram:

$$\begin{aligned}\phi &= W\{\phi_{topo} + \phi_{defo} + \phi_{atmo} + \phi_{orbit} + \phi_{noise}\} \\ &= W\left\{\frac{4\pi}{\lambda} \frac{B_{\perp}}{R \cdot \sin(\theta)} h + \frac{4\pi}{\lambda} v \cdot \Delta t + \phi_{atmo} + \phi_{orbit} + \phi_{noise}\right\}\end{aligned}$$

( $W$ : wrapping operator  $\rightarrow \phi: [-\pi, \pi[$ )

- Phase of a differential interferogram (after compensation of topography phase):

$$\Delta\phi = W\left\{\frac{4\pi}{\lambda} \frac{B_{\perp}}{R \cdot \sin(\theta)} h_{err} + \frac{4\pi}{\lambda} v \cdot \Delta t + \phi_{atmo} + \phi_{orbit} + \phi_{noise}\right\}$$

(where  $h_{err} = h_{true} - h_{DEM}$  is a residual topography phase due to errors in the DEM)





# Limitations and Error Sources of InSAR

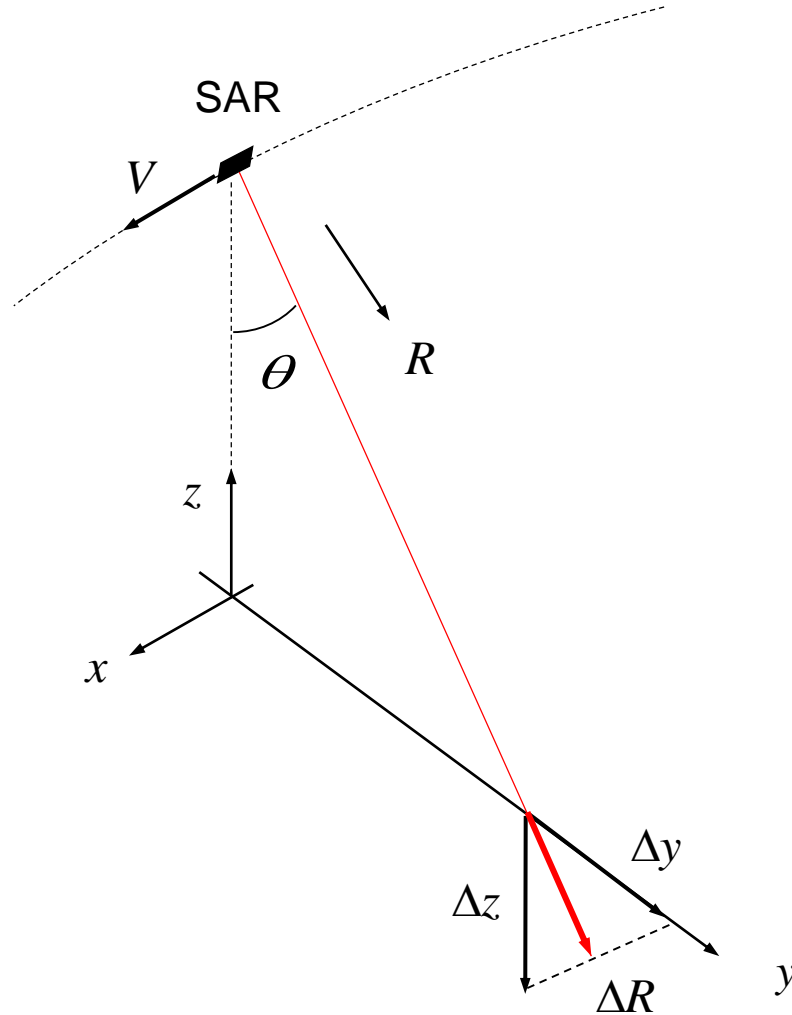
## Overview

1. **Only sensitive to motion in sensor's line-of-sight → does not provide 3D motion fields**
2. **Temporal baseline is limited, leading to limited sensitivity to very slow surface motion:**
  - Limitation is due to temporal decorrelation, leading to increase of phase noise with time
3. **Spatial baseline is limited, limiting number of interferograms that can be formed from a stack of SAR data** [advanced topic – not as relevant with sensors such as Sentinel-1 and NISAR]
4. **Atmospheric phase patterns may mask signal of interest, limiting sensitivity of InSAR to very small motion (or topography) signals**
5. **Orbit errors may cause ramp-like phase distortions** [usually small]



# Limitations of InSAR:

## 1. Only Line-of-Sight Motion Sensitivity



$$\Delta R = \Delta y \sin \theta - \Delta z \cos \theta$$

for ERS:

1 fringe ( $2\pi$ ) corresponds to

2.8 cm in R

3.0 cm in z (e.g. subsidence)

7.2 cm in y (motion)

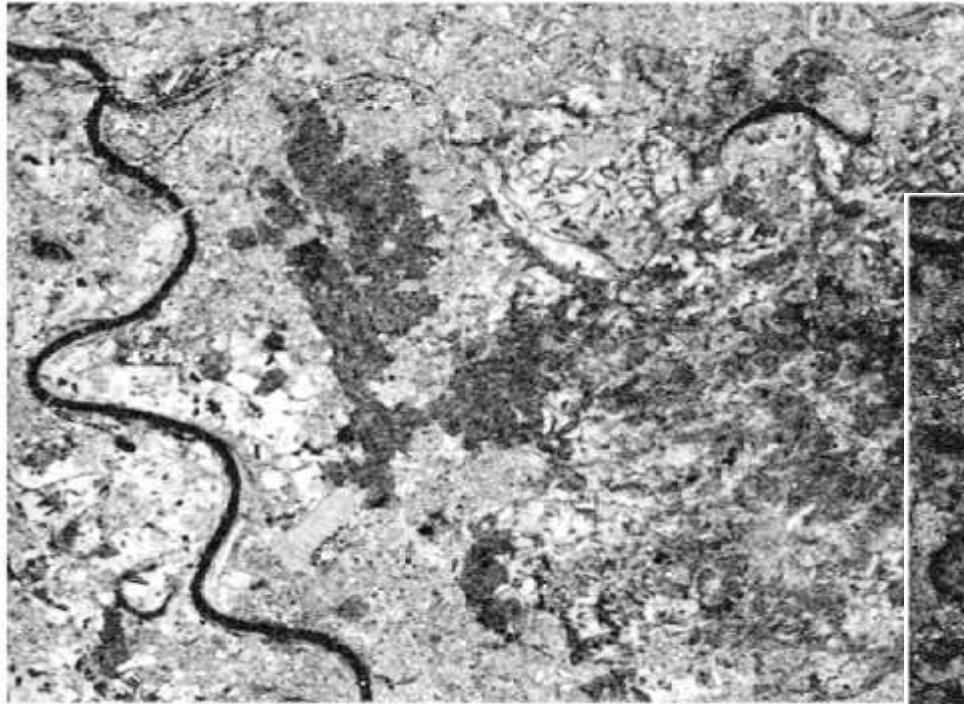
**!** only 1 dimension of 3-d motion accessible  
**!** no sensitivity to motion in x direction



# Limitations of InSAR:

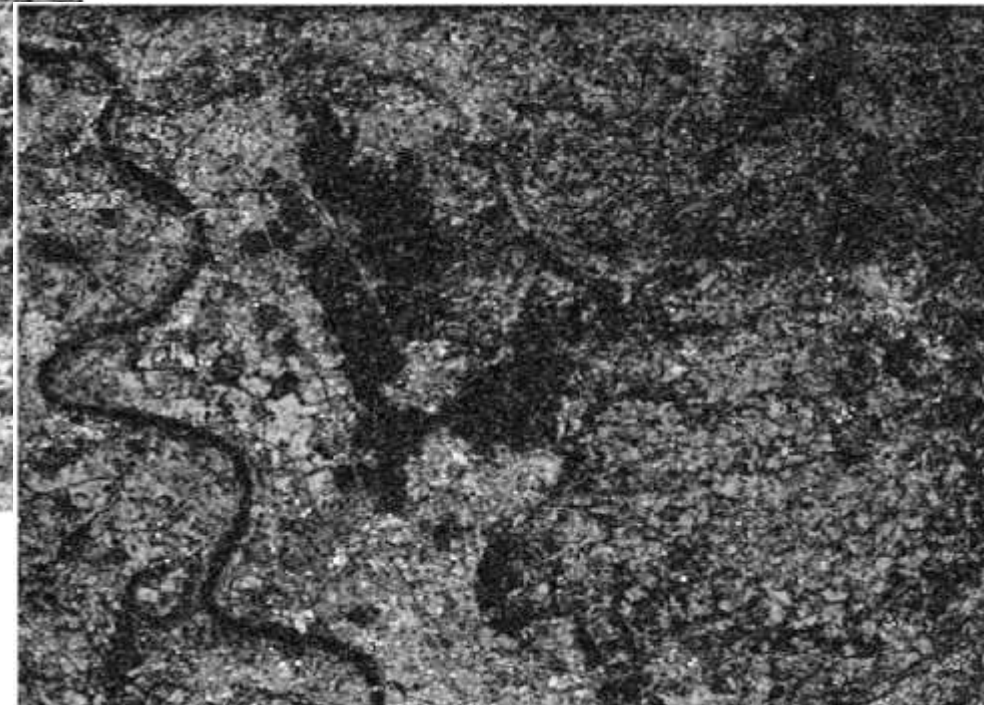
## 2. Temporal Signal Decorrelation

- Changes of the ground scattering properties are main source of signal decorrelation with time
  - Example: Airborne C-band SAR over vegetated environments



short term interferogram (15.01 – 21.01)

long term interferogram (15.01 – 20.02)

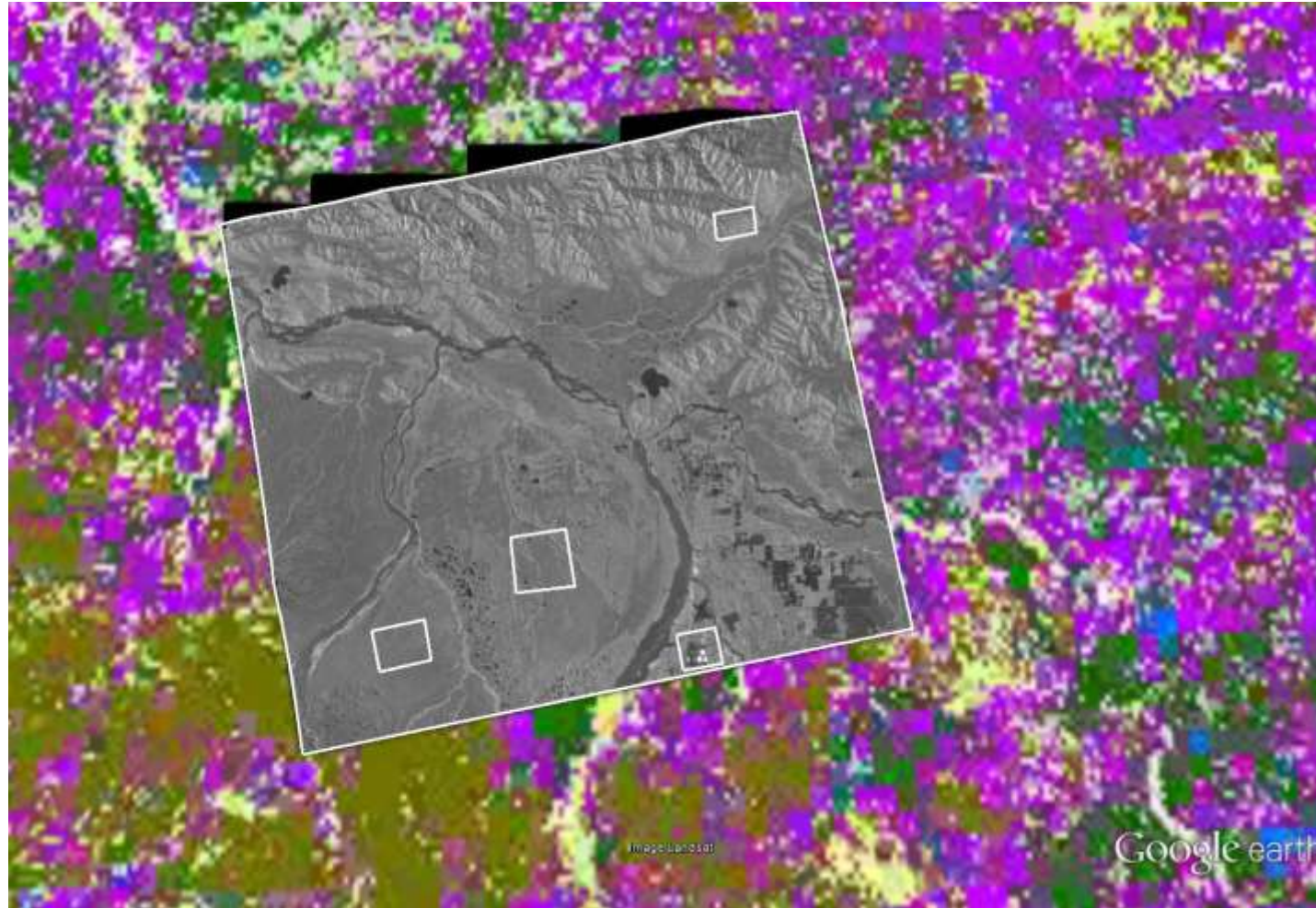




# Examples of Coherence Change with Time

## Boreal Dry Climate

- **Example:** Delta Junction – L-band SAR (ALOS PALSAR)



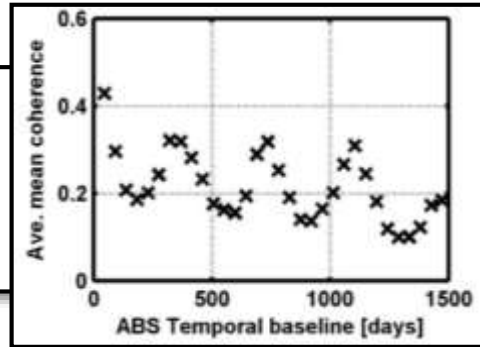
Color	Label
Blue	Water
Dark Green	Evergreen Needleleaf forest
Light Green	Evergreen Broadleaf forest
Medium Green	Deciduous Needleleaf forest
Light Yellow-Green	Deciduous Broadleaf forest
Light Green	Mixed forest
Yellow	Closed shrublands
Dark Yellow	Open shrublands
Purple	Woody savannas
Light Yellow	Savannas
Light Green	Grasslands
Light Blue	Permanent wetlands
Light Orange	Croplands
Red	Urban and built-up
Light Purple	Cropland/Natural vegetation mosaic
White	Snow and ice
Pink	Barren or sparsely vegetated



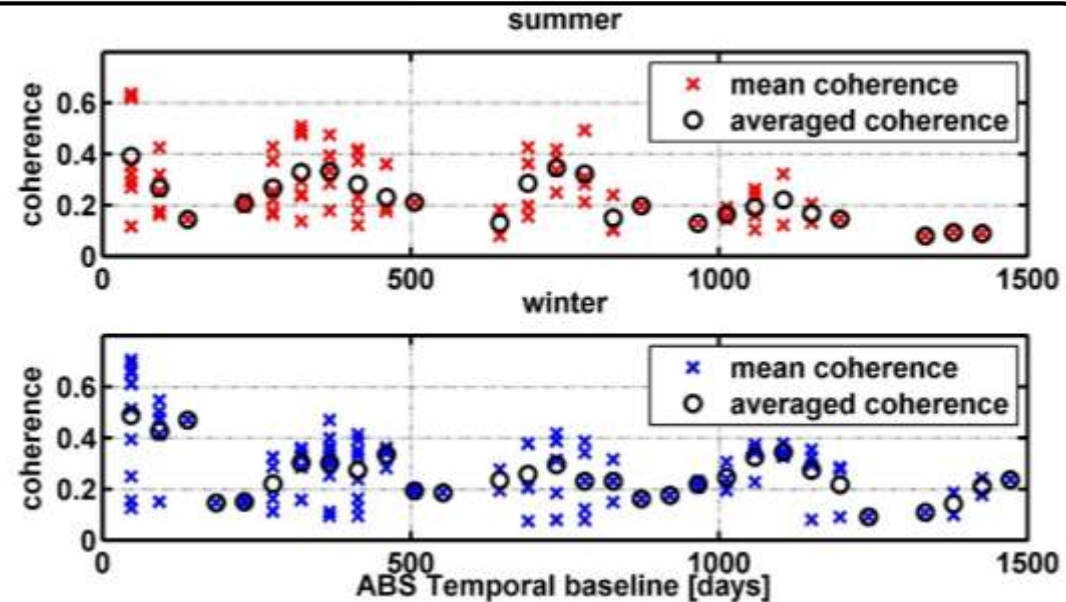
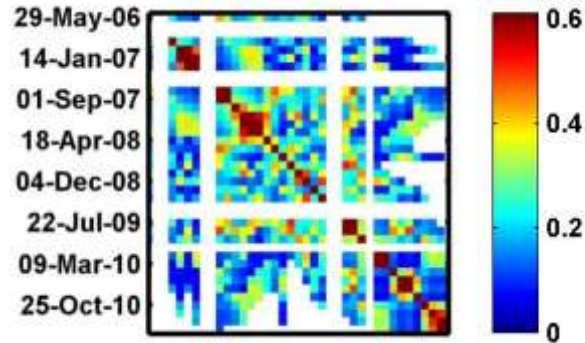
# Examples of Coherence Change with Time

## Boreal Dry Climate

- Delta Junction – Example for Subset-1



- **LULC:** Woody Savannas
- Flat region
- Summer (June to Oct), Winter (Nov. to May)

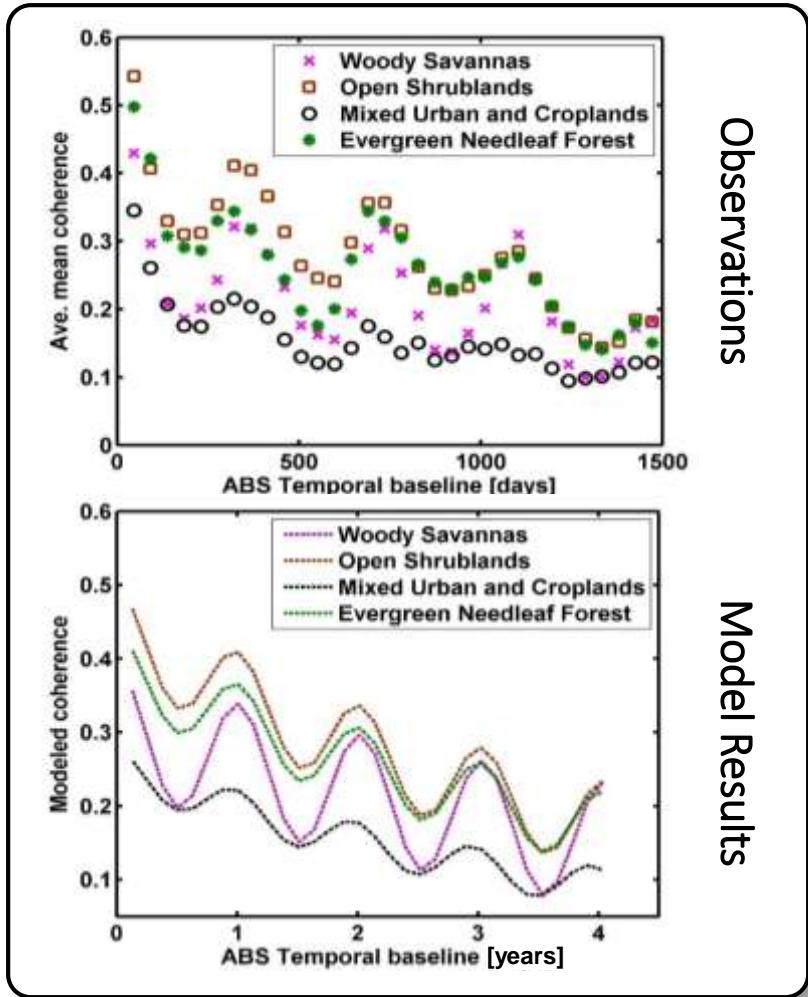




# Examples of Coherence Change with Time

## Boreal Dry Climate

- Estimated Coherence Models – Delta Junction; L-band



LULC type	A	$\lambda$ (1/yr)	$\phi$	B	d (1/yr)	$R^2$
1. Woody Savannas	0.08 $\pm 0.01$	0.99 $\pm 0.01$	0.00 $\pm 0.17$	0.31 $\pm 0.01$	0.18 $\pm 0.02$	0.89
2. Open Shrublands	0.06 $\pm 0.01$	0.99 $\pm 0.02$	0.03 $\pm 0.23$	0.44 $\pm 0.01$	0.23 $\pm 0.02$	0.92
3. Urban & Croplands	0.03 $\pm 0.01$	1.01 $\pm 0.03$	0.00 $\pm 0.47$	0.25 $\pm 0.01$	0.26 $\pm 0.03$	0.80
4. Evergreen Forest	0.05 $\pm 0.01$	0.99 $\pm 0.03$	0.00 $\pm 0.43$	0.39 $\pm 0.02$	0.21 $\pm 0.03$	0.76

### – Coherence Model Characteristics:

$$\bar{\gamma}(t) = A \cdot \cos(2\pi\lambda \cdot t + \phi) + B \cdot \exp(-d \cdot t)$$

- Different exponential decay parameters ( $d$  &  $B$ )
- **Significant** & similar **periodic cycle**  $\lambda$  for analyzed land covers
- Differences in amplitude  $A$  of periodic signal
- Periodicity  $\lambda$  closely one year  $\rightarrow$  near-seasonal signatures
- Good model fit (high  $R^2$ )





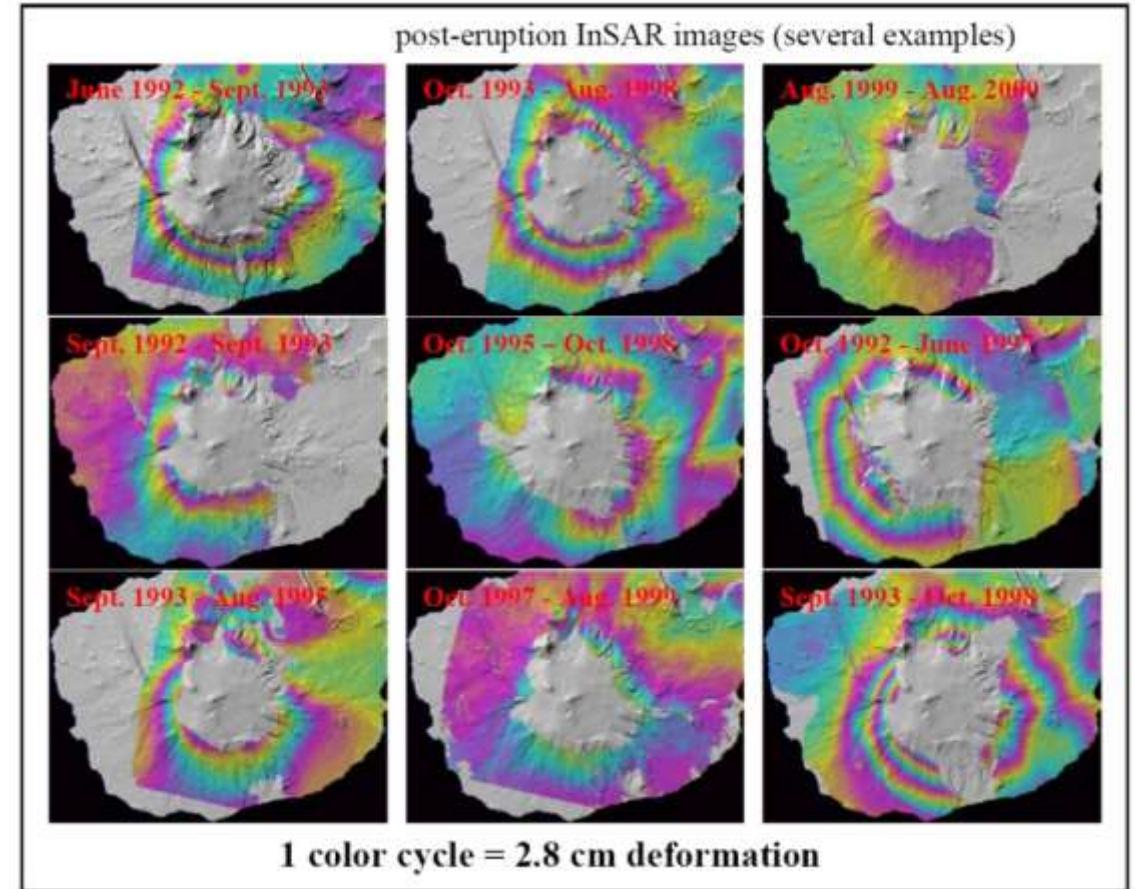
# Limitations of InSAR:

## 2. Temporal Signal Decorrelation

### Example: Volcano Monitoring

- Often, caldera of active volcanoes is decorrelated due to constant change (snow and ice melt; ash fall; lahars; lava flows; ...).
- **Consequence:**
  - Area with strongest signals inaccessible
  - In modeling, shape of source model as well as horizontal location of source hard to define
  - combination with GPS is advised

Caldera of Westdahl Peak is decorrelated in all interferograms



# Decorrelation and Fringe Washing

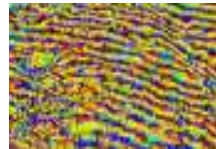
## Gorkha Earthquake, Nepal, April 2015

Decorrelation:  
phase essentially random

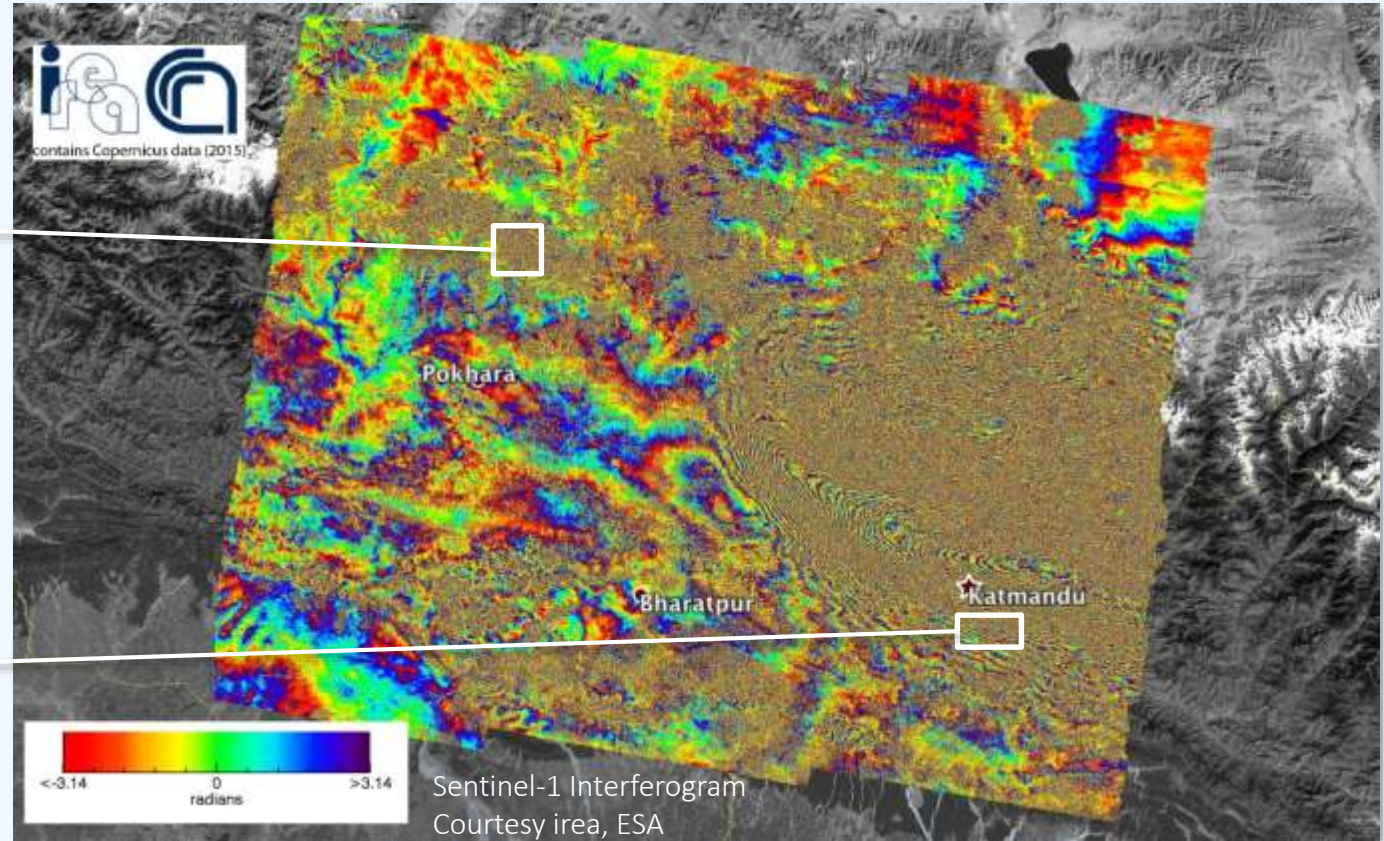


### Fringe Washing

Large strain: fringes closely spaced, difficult to unwrap



Can decrease coherence



Sentinel-1 Interferogram  
Courtesy irea, ESA

InSAR Time Series Analysis is mitigating the impact of signal decorrelation

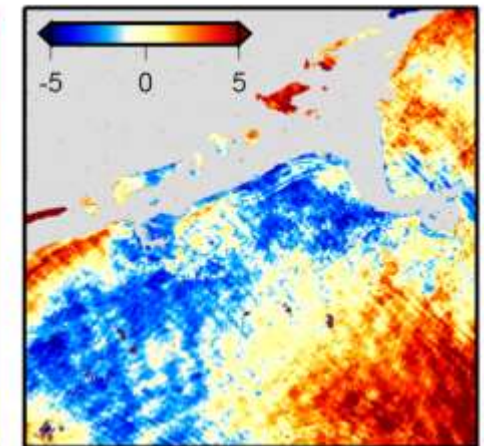
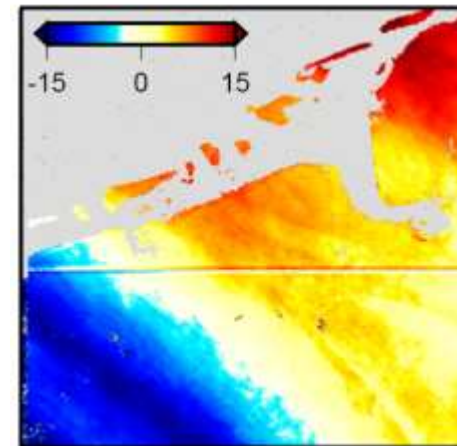
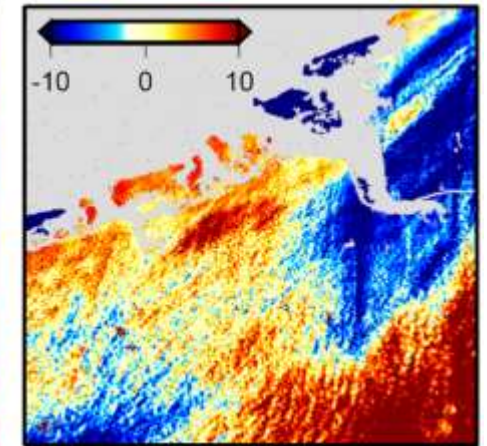
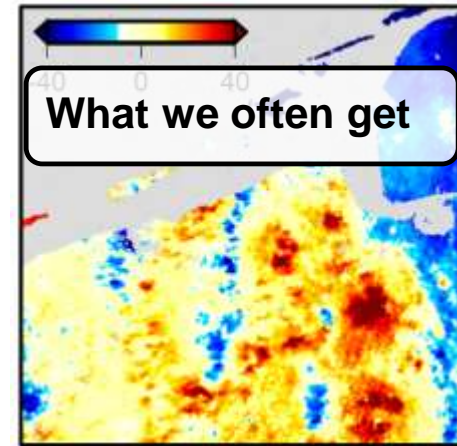
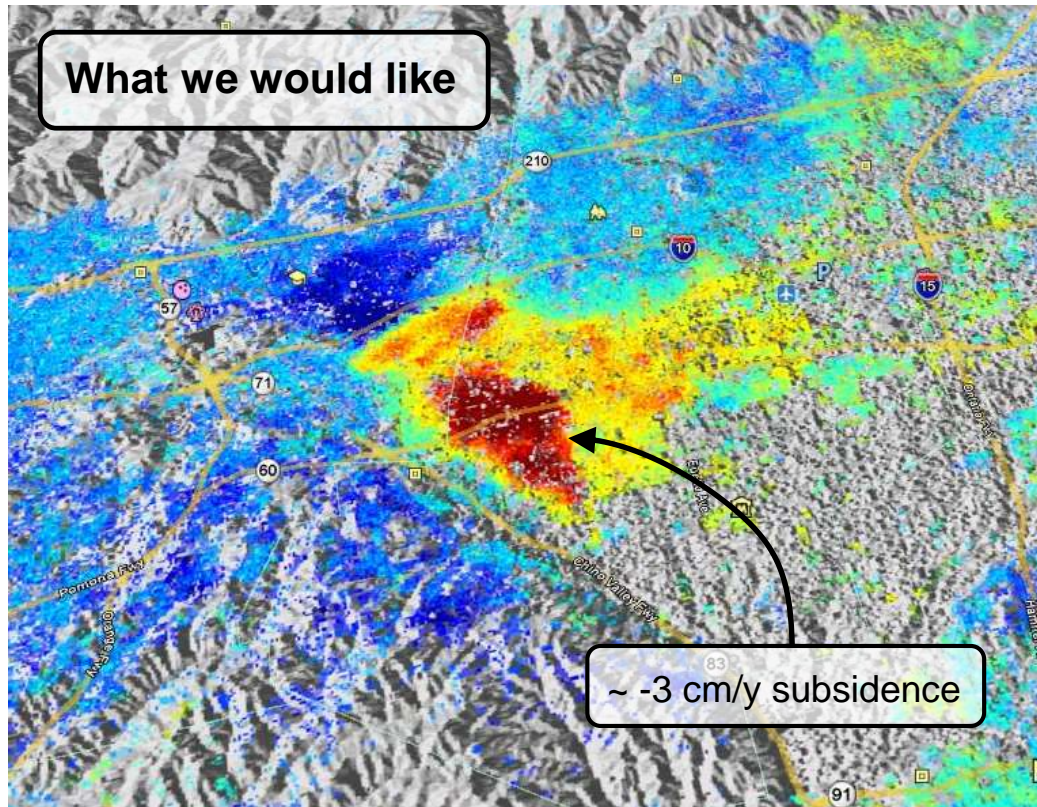




# Limitations of InSAR:

## 4. Atmospheric Distortions

- Atmospheric propagation influence:
  - Masks deformation signals in InSAR
  - Increases data requirements and latency times for InSAR analyses





# Limitations of InSAR:

## 4. Atmospheric Distortions

### Coquimbo Earthquake, Chile, April 2018, M6

#### Turbulent Troposphere:

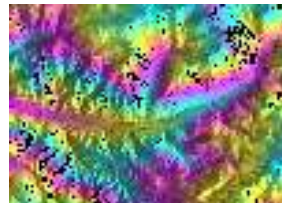
Horizontal variation in refractive index, esp. in water vapor  
Variable across spatial scales  
Can mask small earthquake

#### Correction:

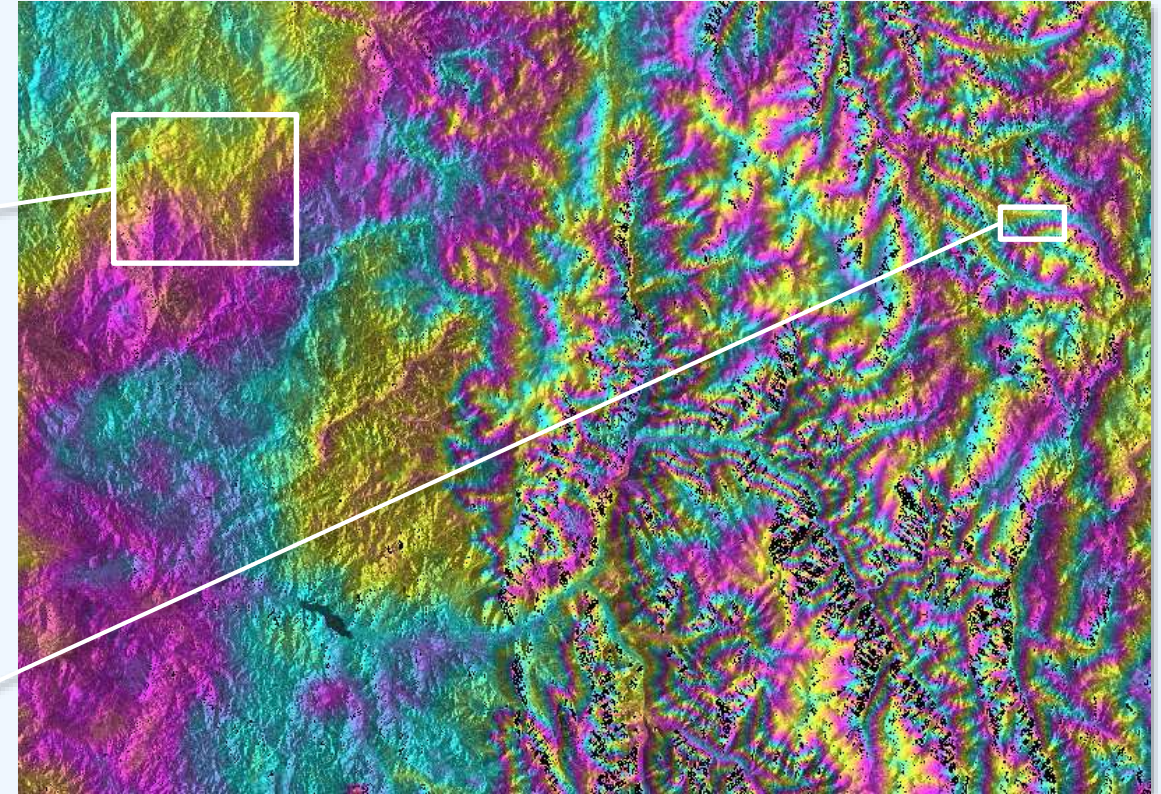
- Regional scale: weather model, GPS, etc.
- Small scale: filtering in space and time

#### Stratified troposphere

Signal path decreases with elevation  
Phase correlated with topography



Correction: weather models, data-driven

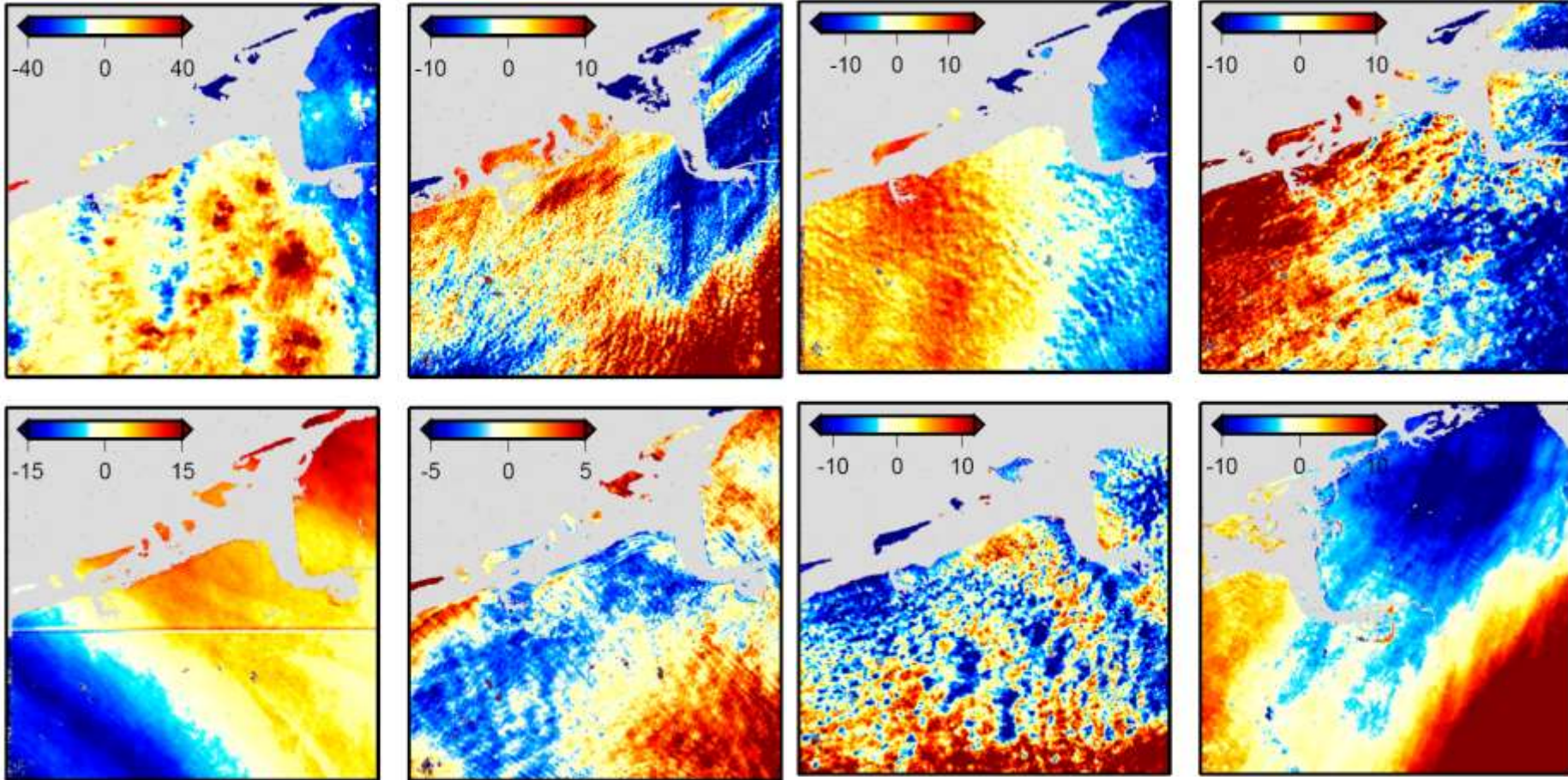


Sentinel-1 Interferogram  
Courtesy SARVIEWS, ESA



# Examples of Turbulent Atmospheric Phase Distortions in InSAR Data

- 8 100x100 km interferograms showing atmospheric distortions [cm]

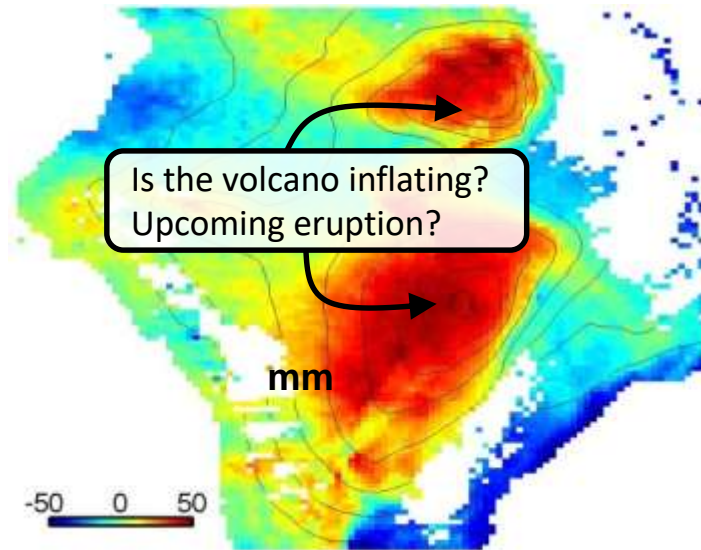


Courtesy: R. Hansen, TU Delft

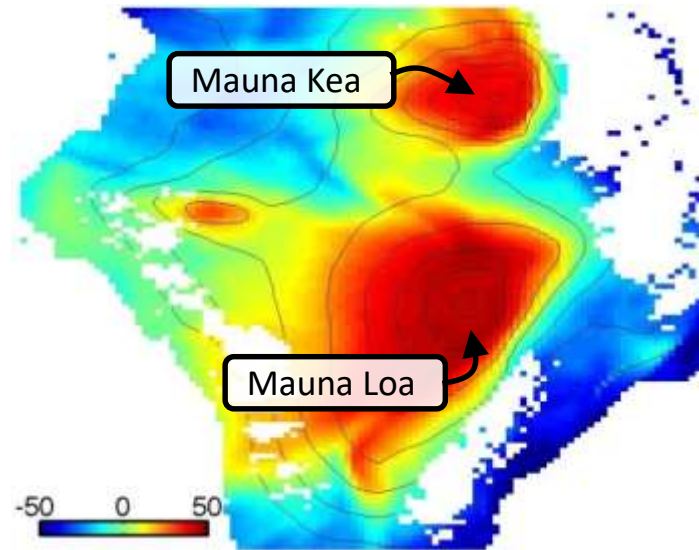


# Example and Impact of **Stratified** Atmospheric Phase Distortions

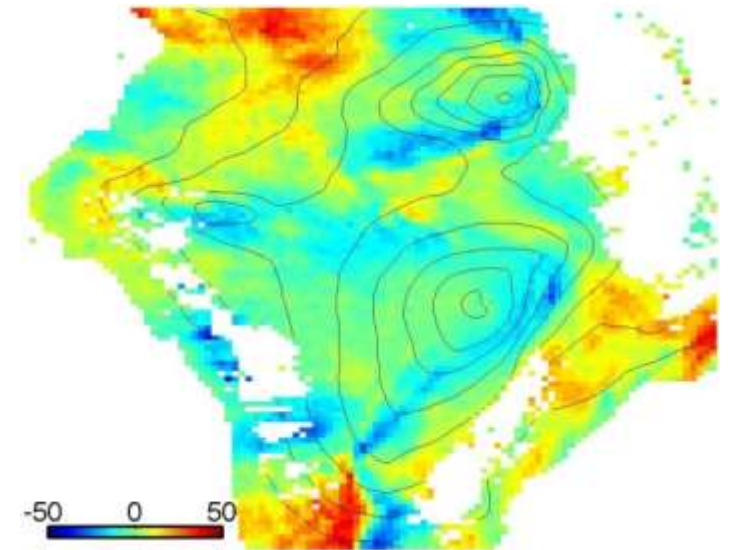
Atmospheric Signals can lead to incorrect interpretation of observations:



d-InSAR Observations,  
Big Island, Hawaii



Atmospheric Model



Phase after subtracting the  
Atmospheric Model





# Limitations of InSAR:

## 4. Atmospheric Distortions

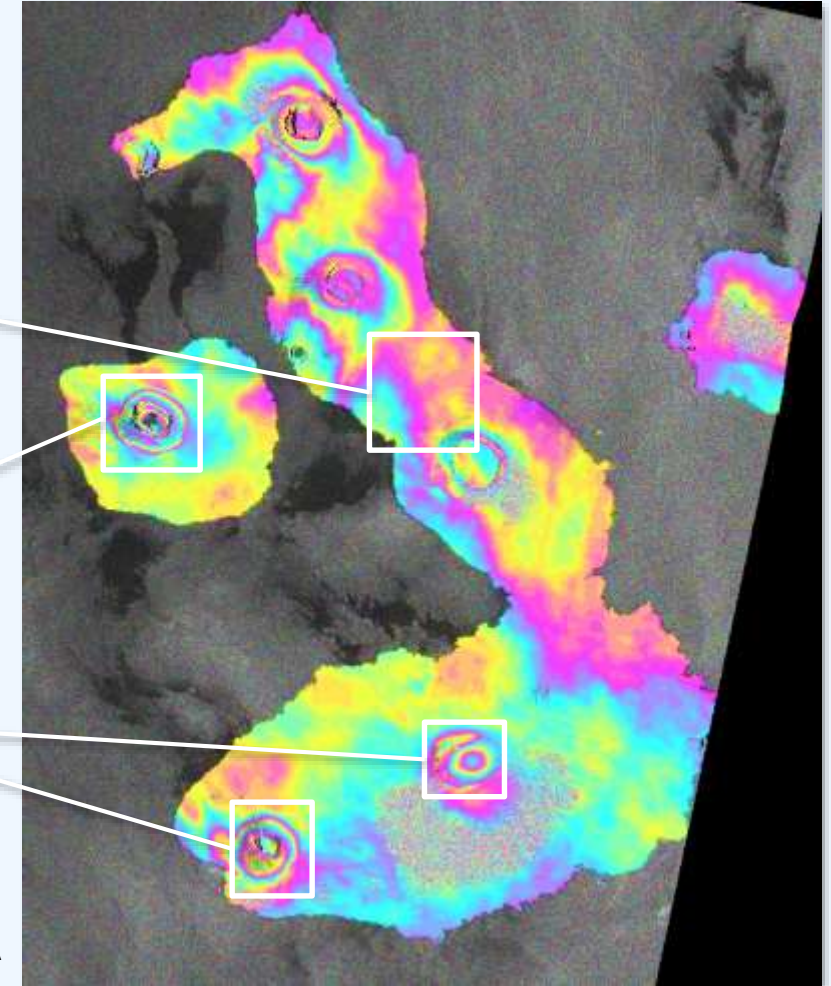
### Isabela Island, Galapagos, Ecuador, September 2019, M6

Troposphere or volcanic origin?

Stratified troposphere or volcanic origin?

How could you quantify the relative contributions?

InSAR Time Series Analysis is mitigating the impact of atmospheric phase delay



Sentinel-1 Interferogram  
Courtesy SARVIEWS, ESA

# What's Next?

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- **This is what awaits next:**
  - **Thursday March 30: Lab on Interpreting InSAR data**
  - **Tuesday April 04: Polarimetric SAR**

