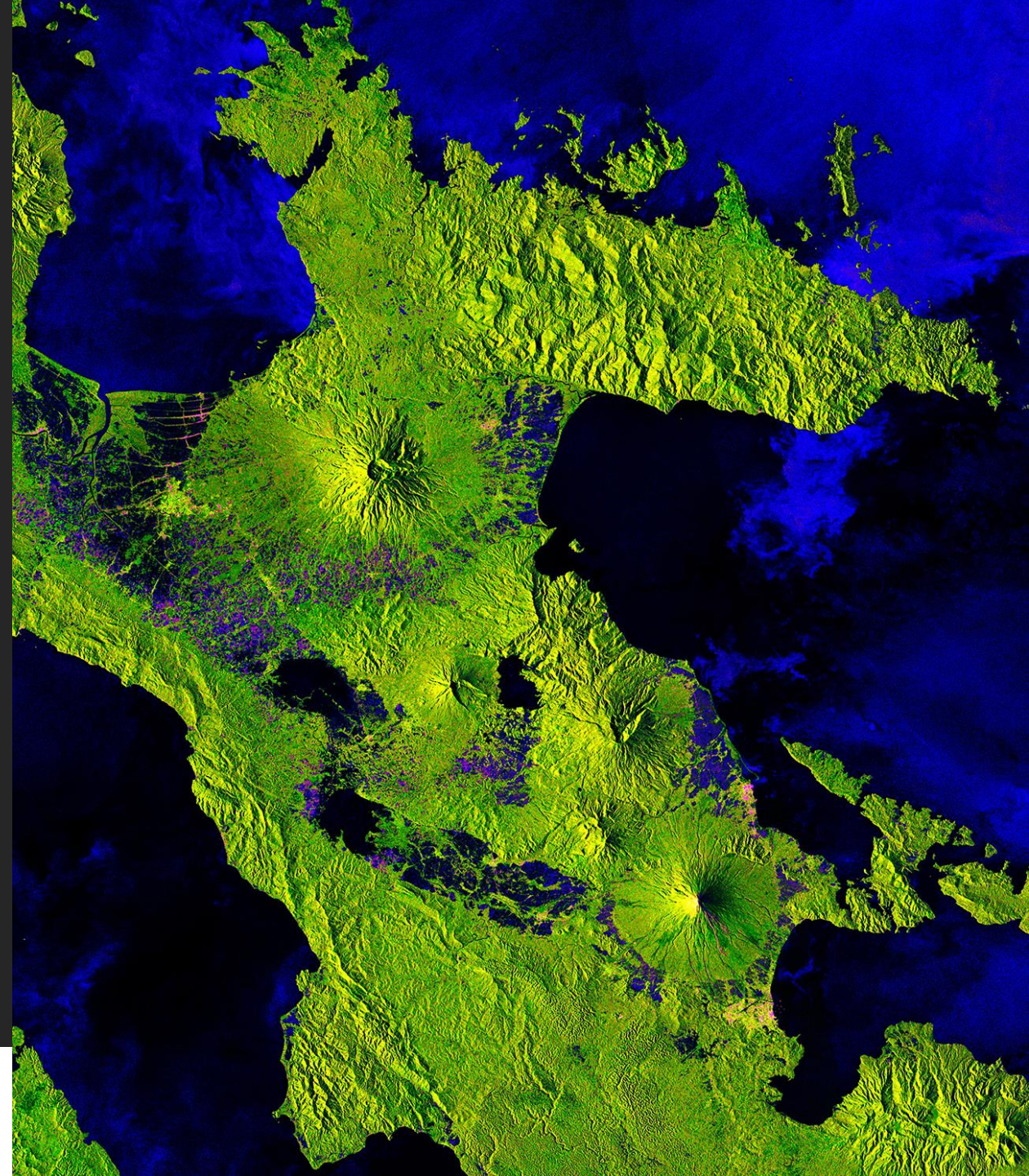


# Satellite remote sensing as a tool for monitoring earthquake- and volcano- related ground deformation

Bryan J. Marfito, Janine L. Israel, Winchelle Ian G. Sevilla,  
Mabelline T. Cahulogan, Arturo S. Daag and Renato U. Solidum Jr.

Remote Sensing Research & Development for Natural Hazards & Disasters



# **OUTLINE**

**I. INTRODUCTION**

**II. INSTRUMENTS AND PROCESSING**

**III. USES OF DINSAR**

**IV. OUTPUTS**

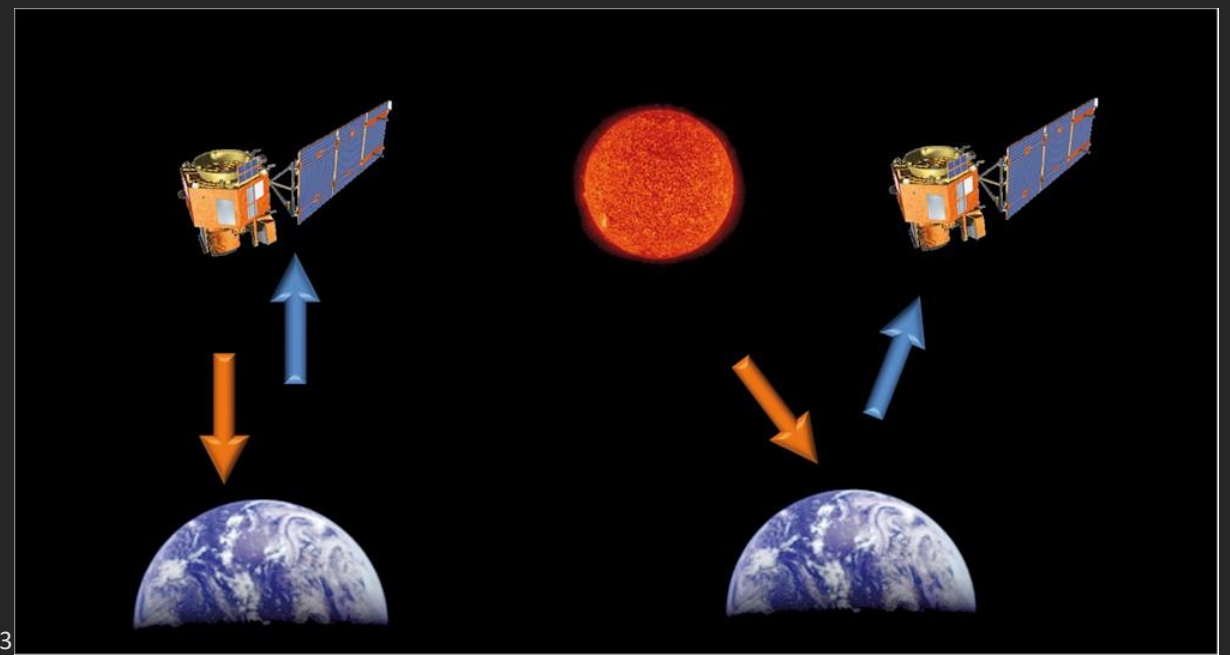
**V. CONCLUSION**

**VI. WAY FORWARD**

# I. INTRODUCTION

# What is remote sensing?

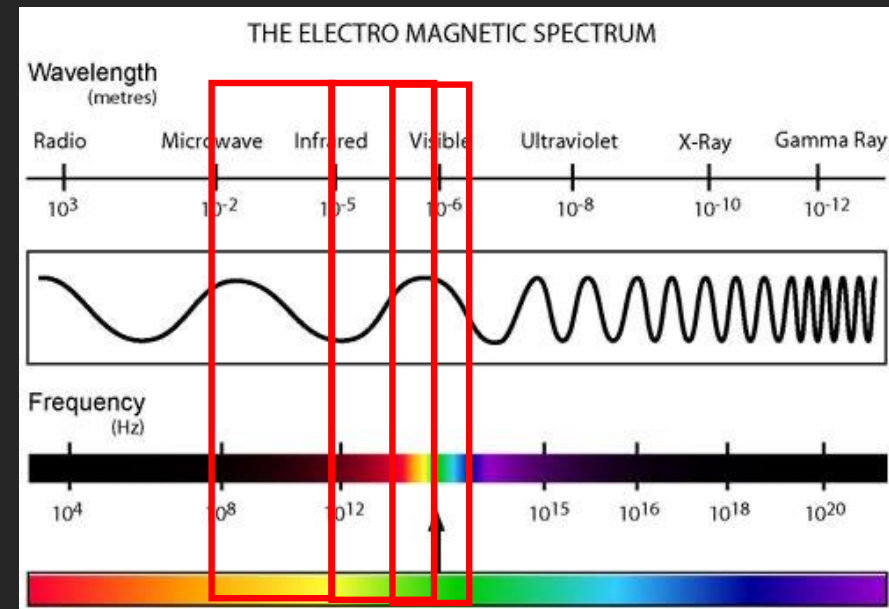
- Remote Sensing - art and science of observing an object without having a physical contact with it (Lillesand et al., 2015)
- Two types of remote sensing based on energy source
  - Active remote sensing
  - Passive remote sensing
- Three types of remote sensing based on sensor
  - Optical – visible light
  - Infrared – thermal infrared, short and medium wavelength infrared
  - Radar – microwave, radio



Hennig, 2013

Active

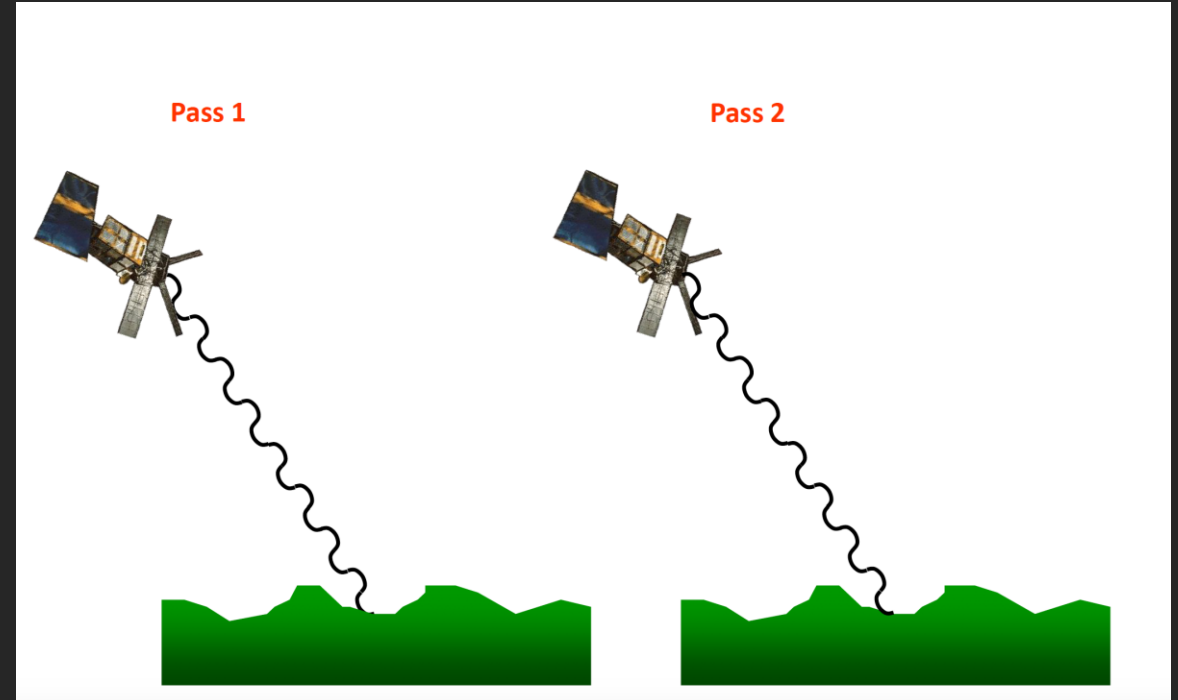
Passive



OpenStax, 2019

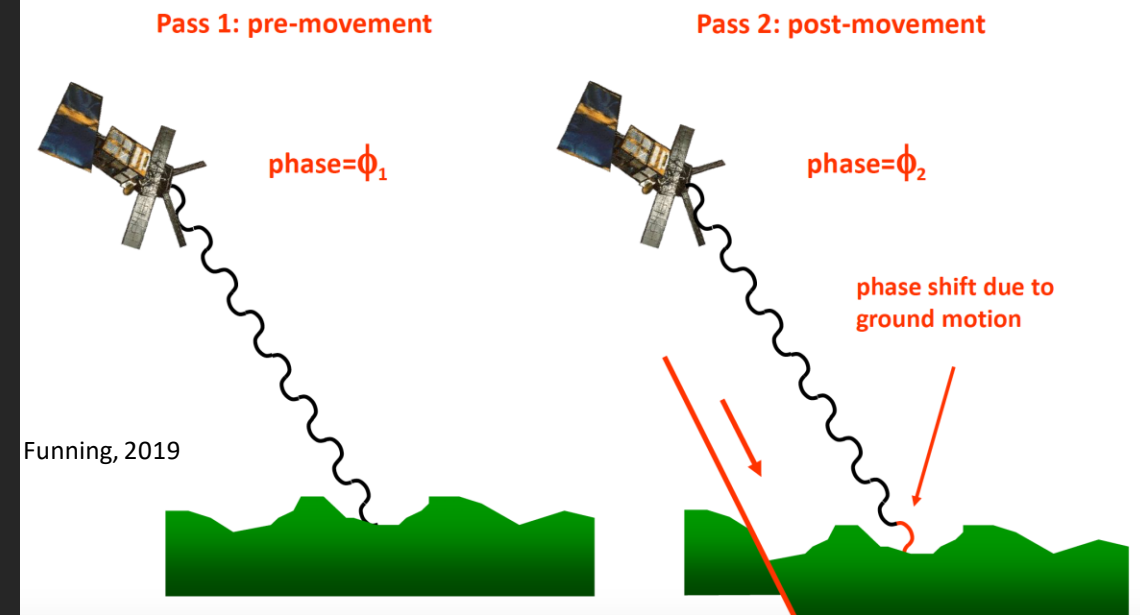
# What is InSAR?

- **Interferometric Synthetic Aperture Radar**
  - Phase data from interference or superimposition of EM waves from different viewing angle (parallax) generates topography of an area
  - Uses repeated pulses to replicate a large antenna
  - Microwave EM spectrum



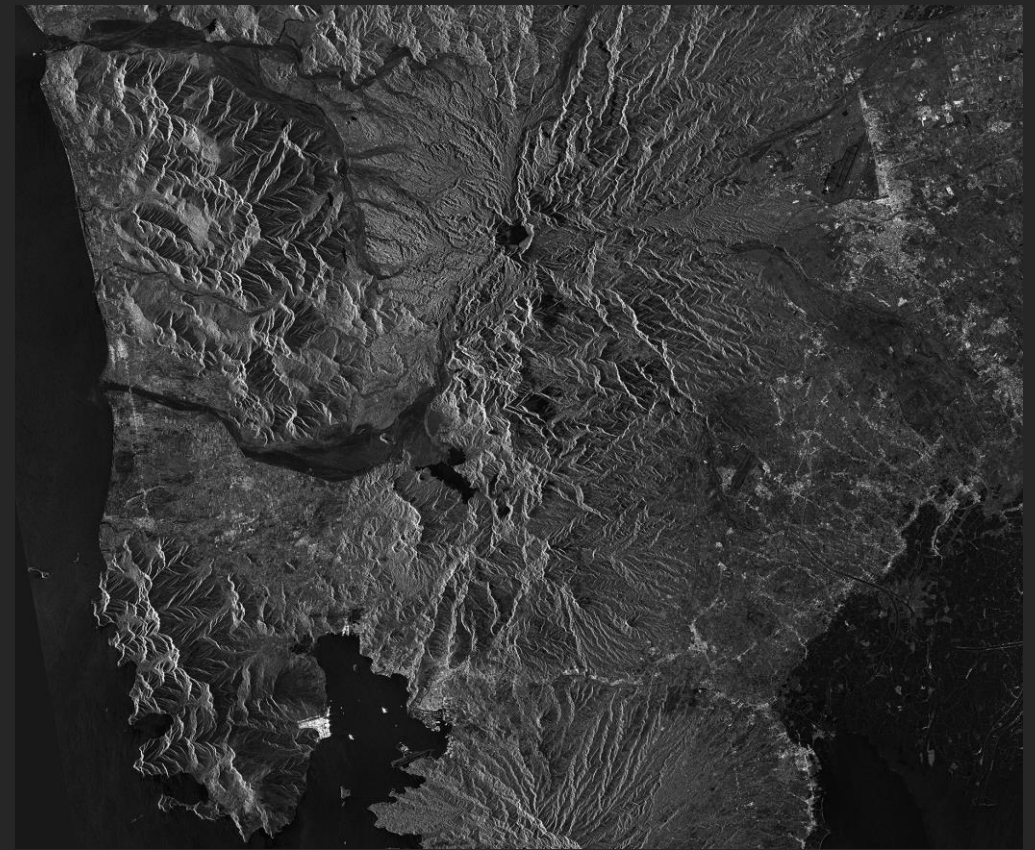
# What is DInSAR?

- Differential + InSAR
- Generated by the pre- and post-event images from a satellite
- If a DEM is used to remove topography, InSAR could be used to measure displacement



# Geometry of Radar Image

- Radar image of Pinatubo Volcano (7 April 2014)
- Different geometrical characteristics as opposed to optical remote sensing due to sidescan method of acquisition



ESA, 2014

## Radar Image Coordinate System

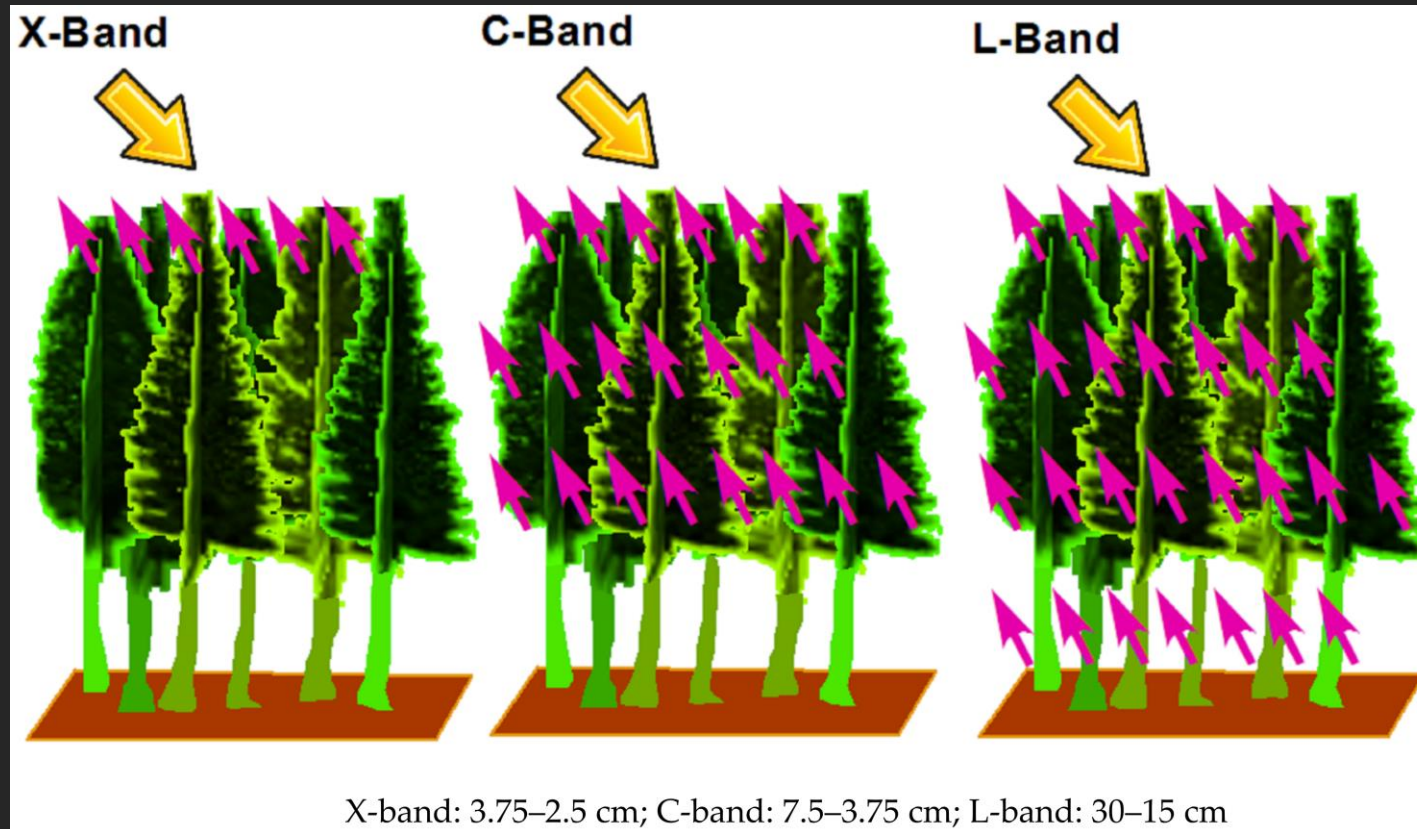


# II. INSTRUMENTS AND PROCESSING

**TABLE 1. COMMONLY USED FREQUENCY BANDS FOR SAR SYSTEMS AND THE CORRESPONDING FREQUENCY AND WAVELENGTH RANGES. APPLICATION EXAMPLES ARE: 1) FOLIAGE PENETRATION, SUBSURFACE IMAGING AND BIOMASS ESTIMATION IN P- AND L-BAND; 2) AGRICULTURE, OCEAN, ICE OR SUBSIDENCE MONITORING IN L-, C-, S- AND X-BAND; 3) SNOW MONITORING IN X- AND KU-BAND; AND 4) VERY HIGH-RESOLUTION IMAGING IN X- AND KA-BAND. MOST USED FREQUENCY BANDS ARE L-, C- AND X-BAND.**

Frequency Band	Ka	Ku	X	C	S	L	P
Frequency [GHz]	40–25	17.6–12	12–7.5	7.5–3.75	3.75–2	2–1	0.5–0.25
Wavelength [cm]	0.75–1.2	1.7–2.5	2.5–4	4–8	8–15	15–30	60–120

Moreira et al., 2013

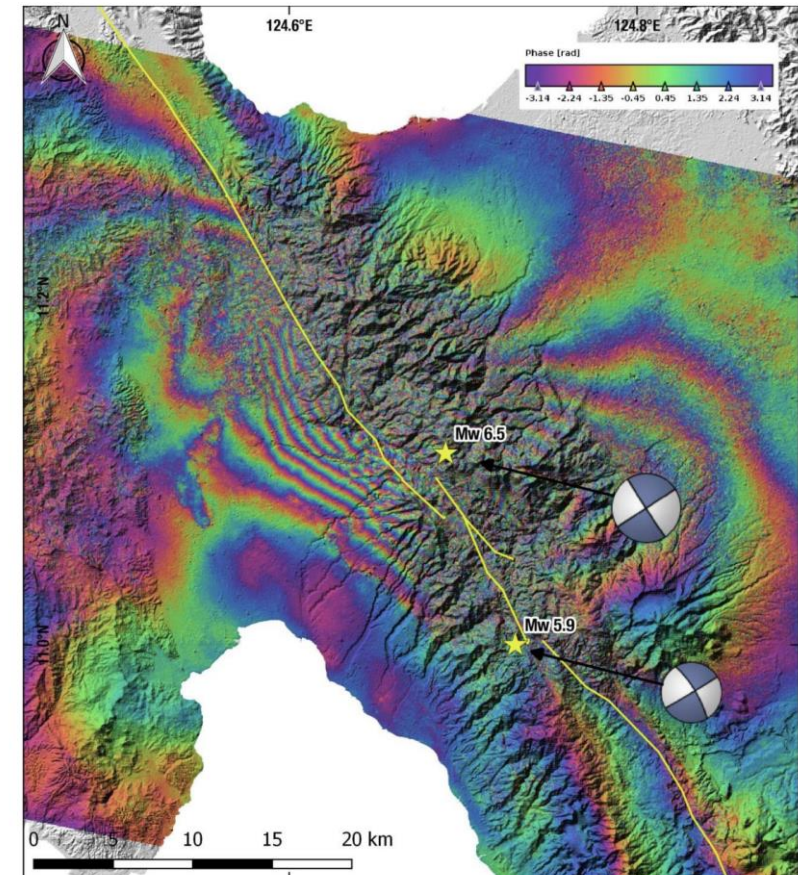
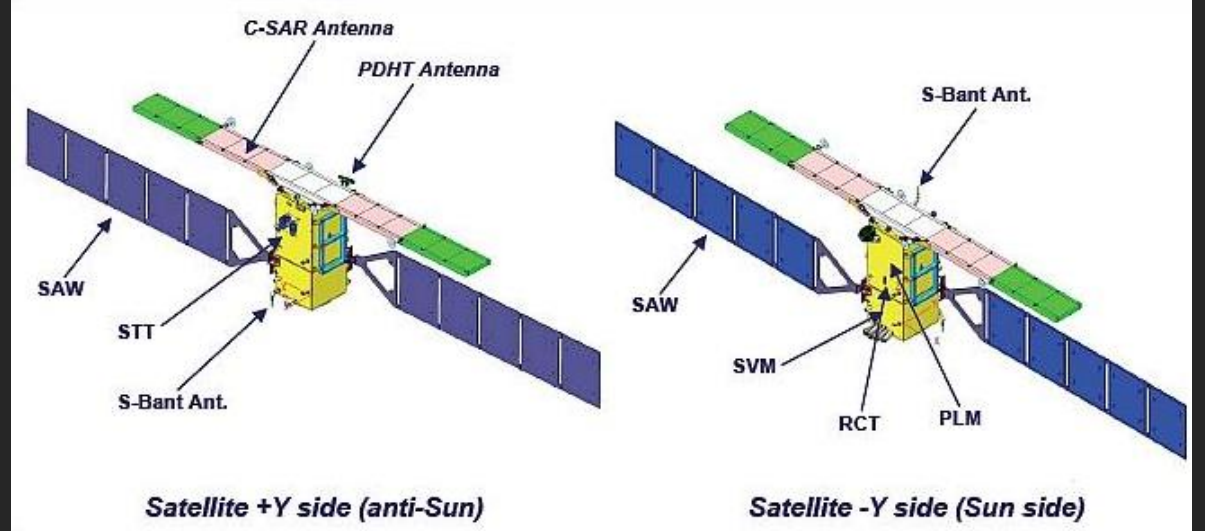


Pham et al., 2019

# Sentinel 1-A & B

- Pair of earth observation satellites launched by ESA
- Orbit
  - Sun synchronous orbit with declination of  $98.16^\circ$
  - 6 day (pair of satellites) or 12 day (single satellite) repeat pass on same area
- Center frequency = 5.405 GHz (C-band)
- Incidence angle =  $20^\circ$  to  $46^\circ$
- Look direction = right
- 1 fringe = approx. 3 cm of LOS displacement

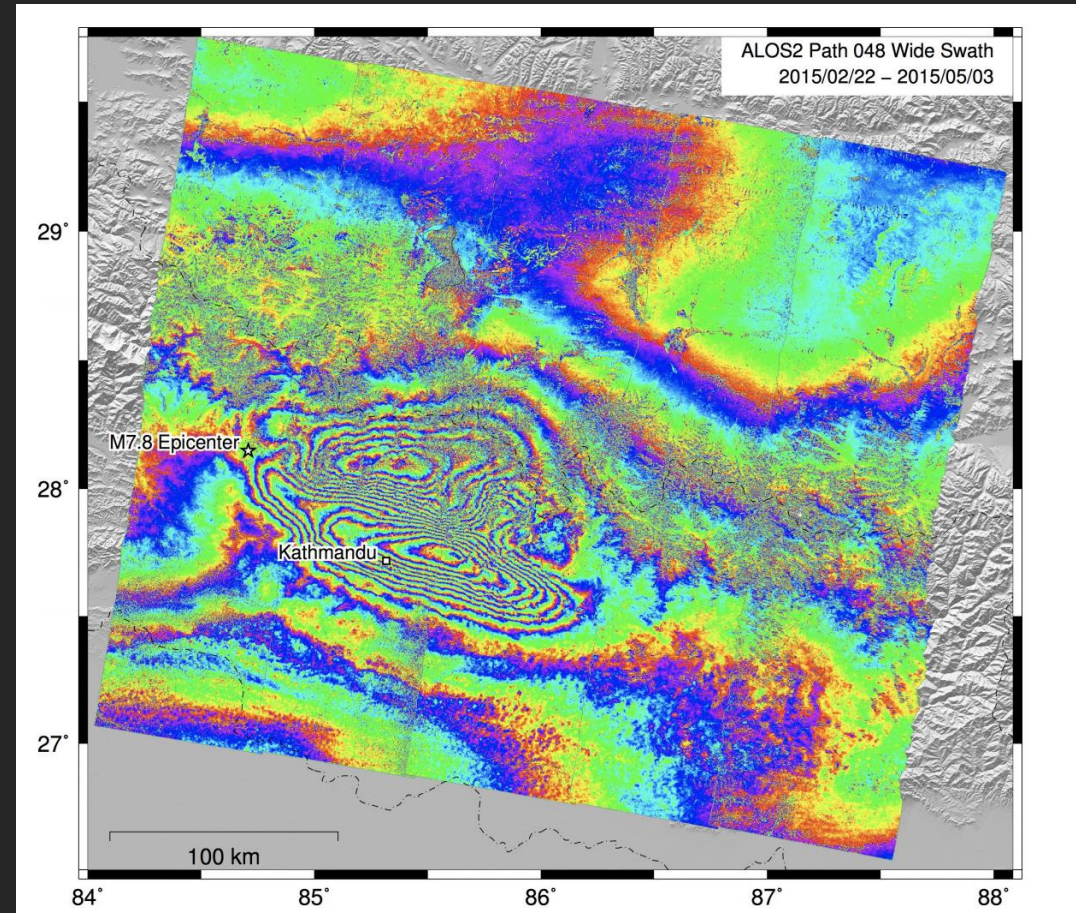
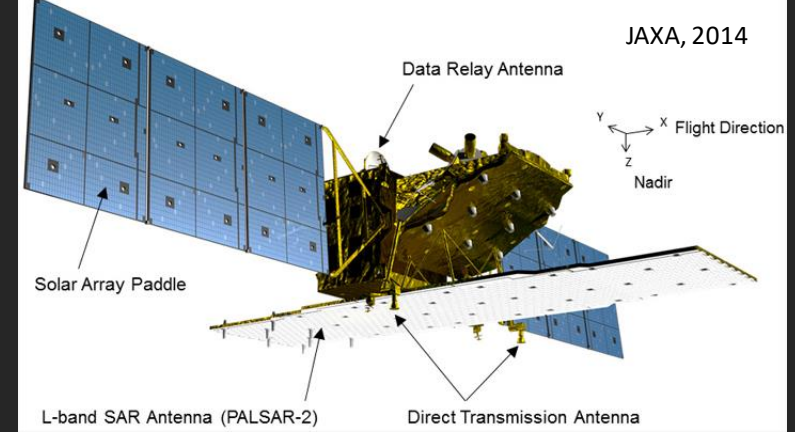
ESA, 2019a



Valkaniotis et al., 2017

# ALOS-2

- Satellite launched by JAXA last 4 May 2014
- Orbit:
  - Sun synchronous orbit with declination of  $97.9^\circ$
  - 14 day repeat pass on same area
- Center frequency = 1.25 GHz (L-band)
- Incidence angle =  $8^\circ$  to  $70^\circ$
- Look direction = right or left
- 1 fringe = approx. 12 cm of displacement



2015 M<sub>w</sub>7.8 Gorkha Earthquake in Nepal

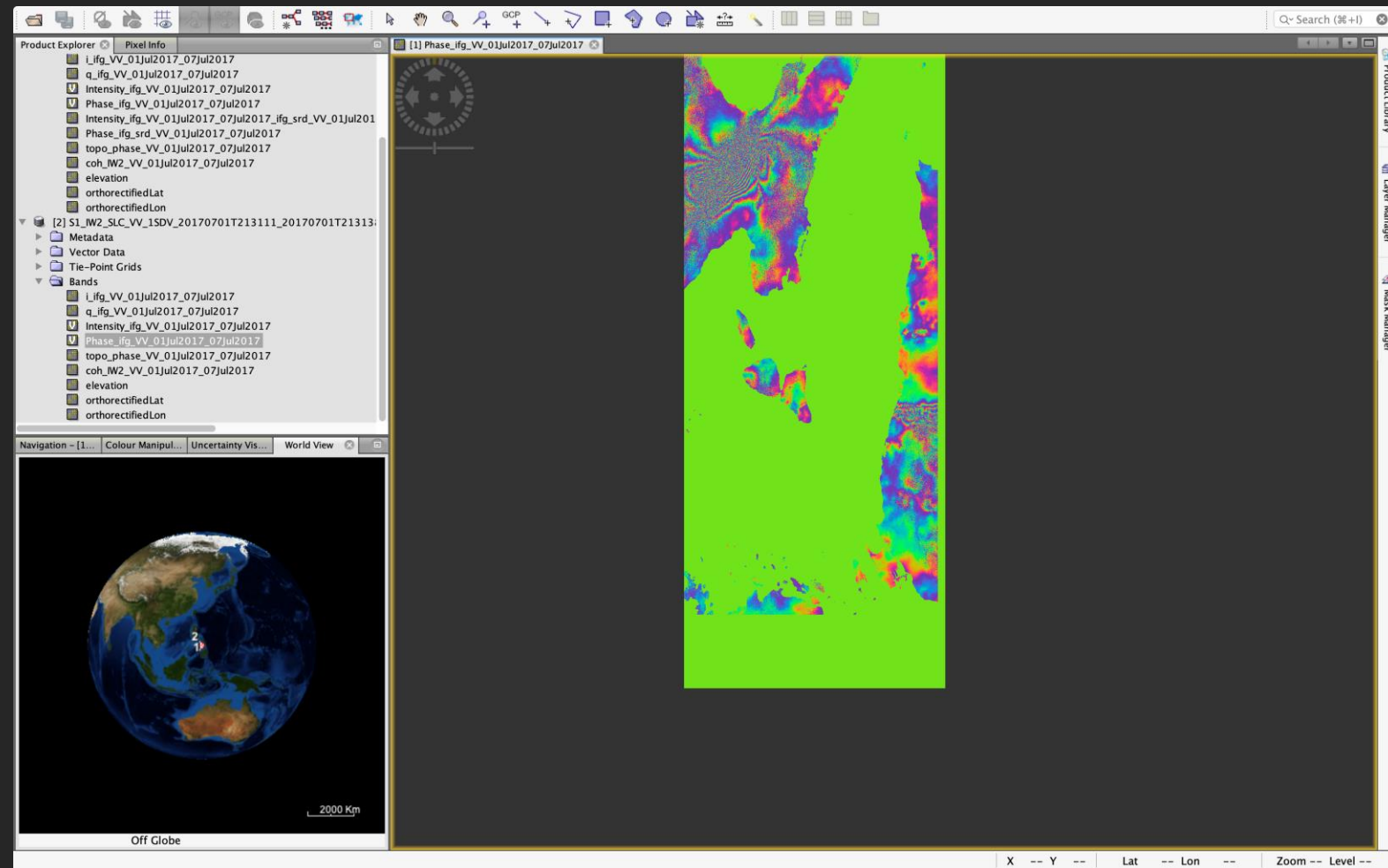
Lindsey et al., 2015



# DInSAR processing softwares

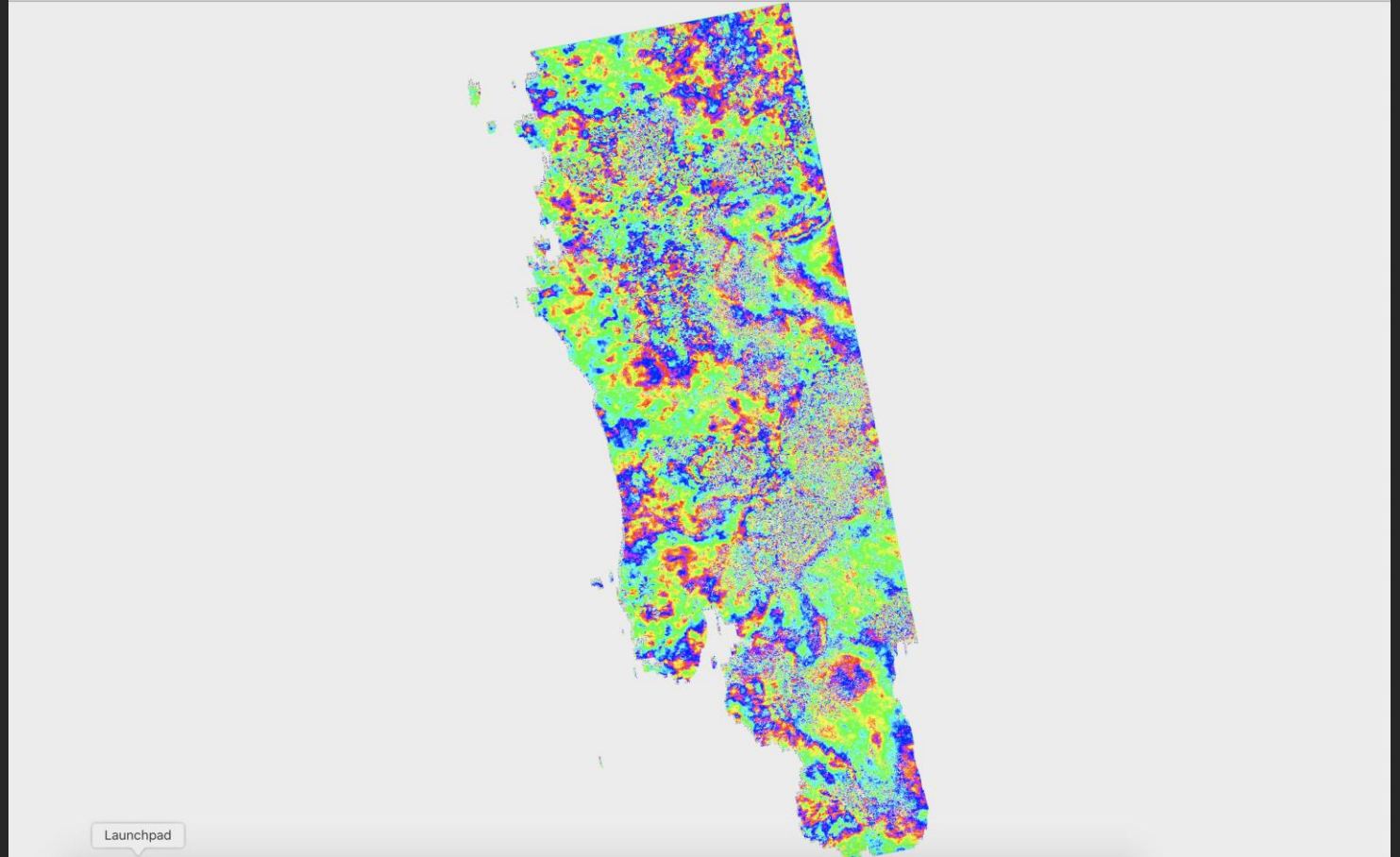
- SNAP

- GUI processing software developed by ESA to process Sentinel data
- It could also process ALOS-2 images
- Ease of use due to presence of graph builder and batch processing modules



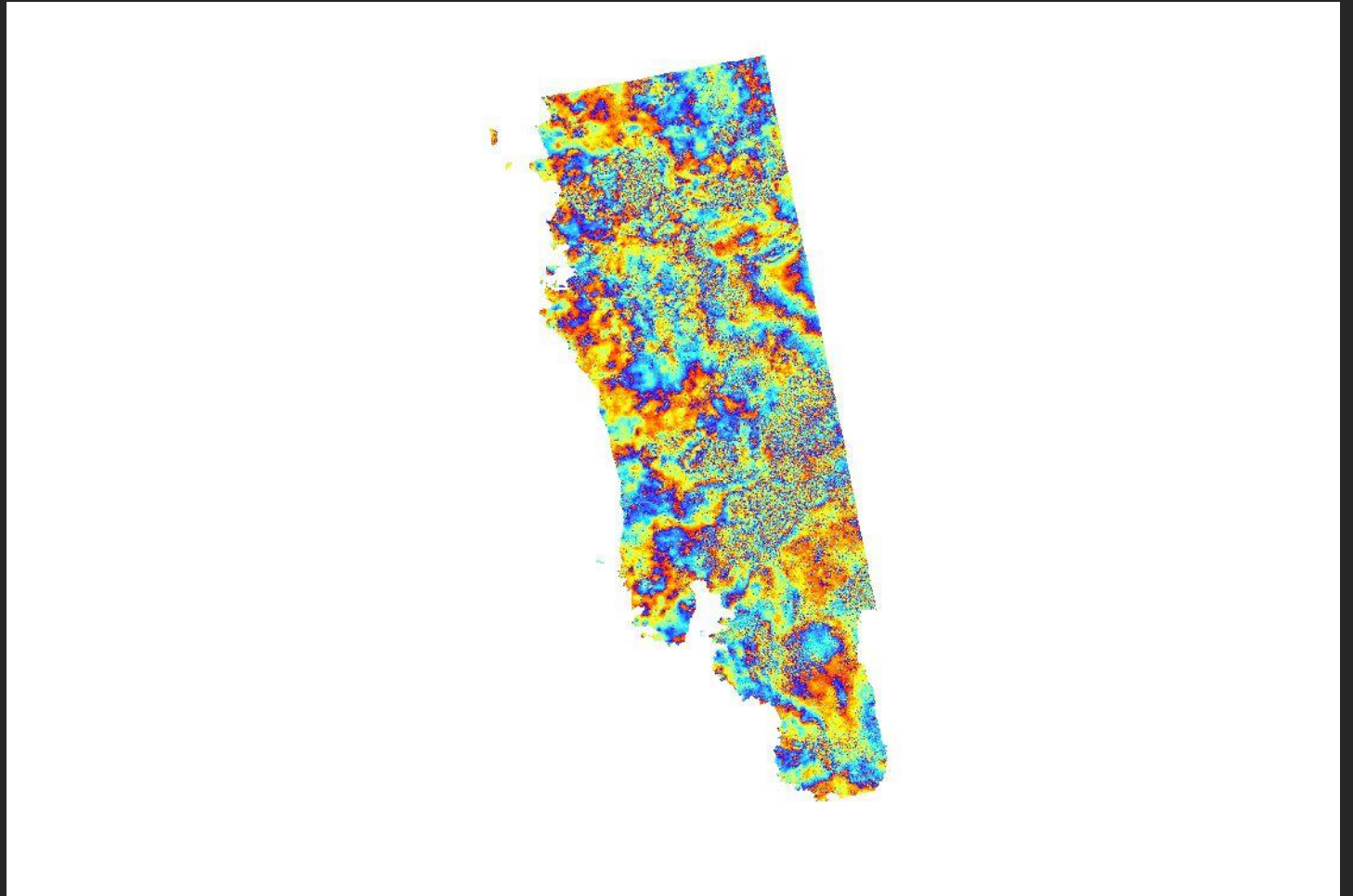
# DInSAR processing softwares

- GMTSAR
  - Developed by the Scripps Institute of Oceanography
  - Doesn't have GUI
  - Uses bash scripts to process InSAR images
  - This software could process many types of InSAR satellite data such as Sentinel 1, ALOS-2, Radarsat, Envisat



# DInSAR processing softwares

- ISCE
  - Developed by the NASA-JPL
  - Doesn't have GUI
  - Uses Python scripts to process InSAR images
  - This software could process many types of InSAR satellite data such as Sentinel 1, ALOS-2, Radarsat, Envisat
  - Among all the software used, ISCE is the fastest and the most flexible of them all



# III. USES OF DINSAR

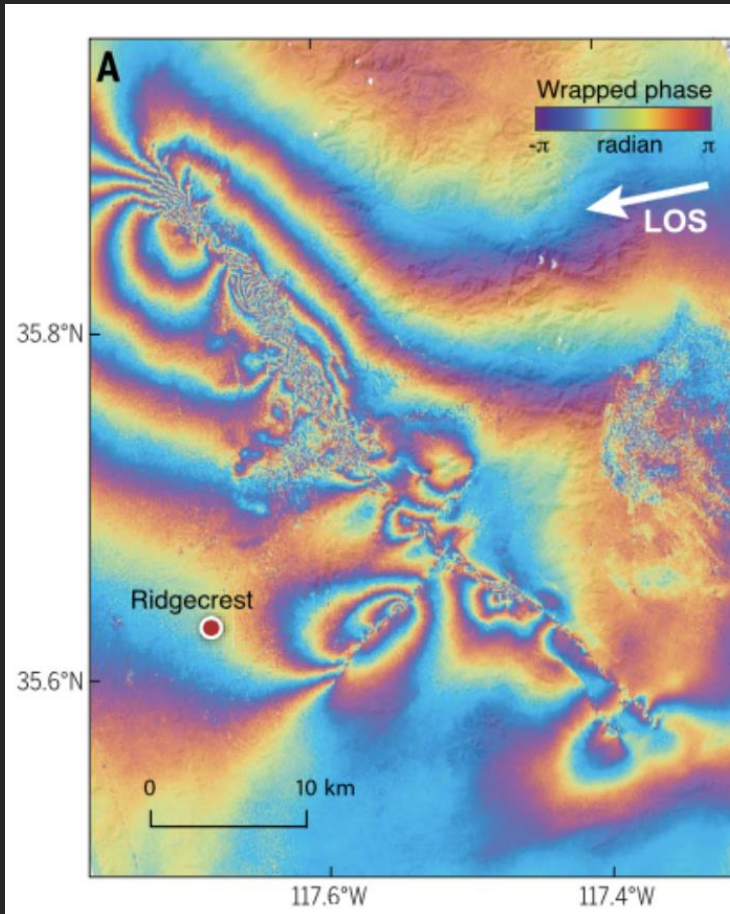
# Uses of DInSAR for geohazard studies

- Earthquake

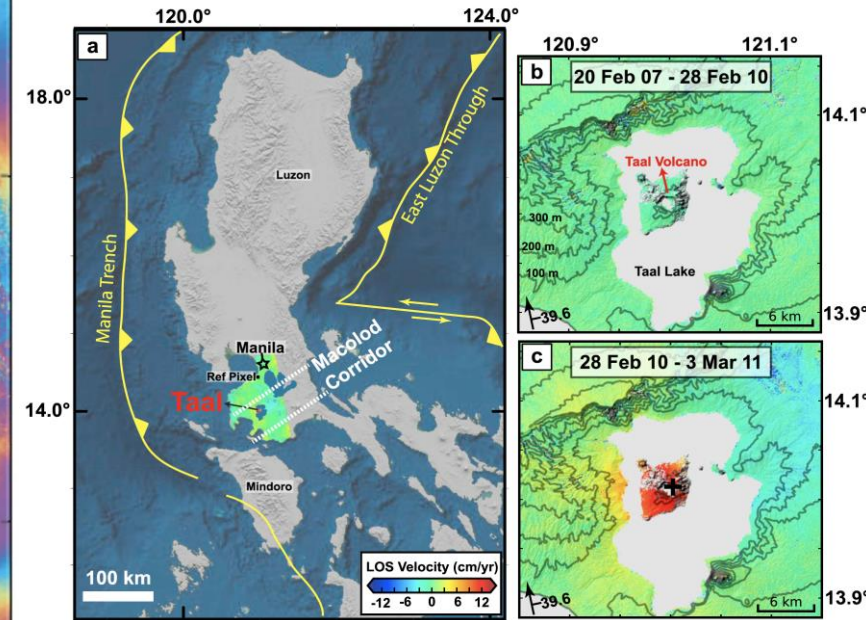
- Identification of possible seismogenic fault
- Measure coseismic slip and interseismic slip rate

- Volcano

- Measurement of inflation and inflation rate
- Measurement of viscoelastic response due to magma flow



2019  $M_w$  6.4 and 7.1 Ridgecrest Earthquakes  
Source: Ross et al., 2019

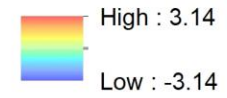
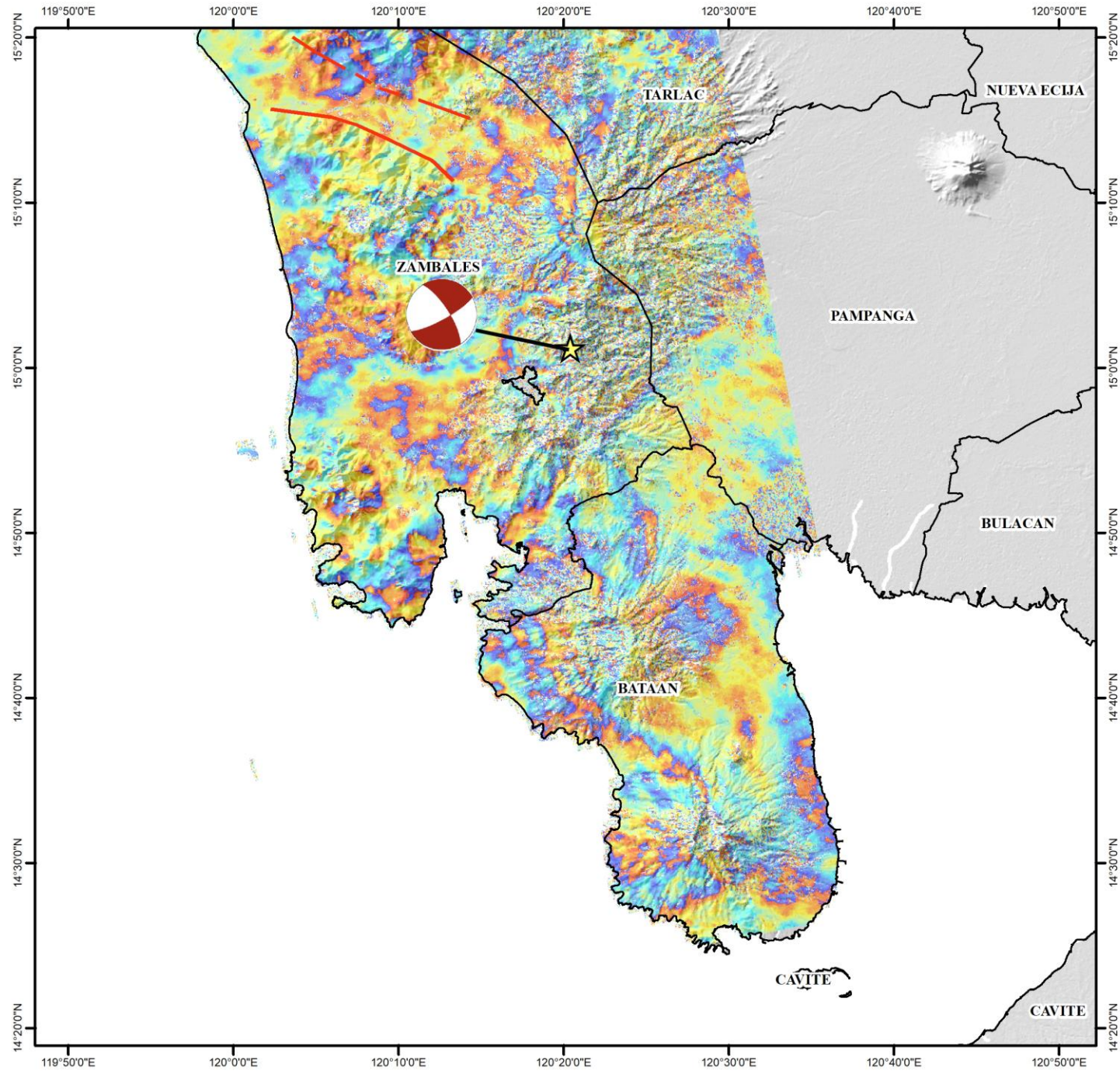


2010-2011 Taal volcano inflation event  
Source: Morales Rivera et al., 2019

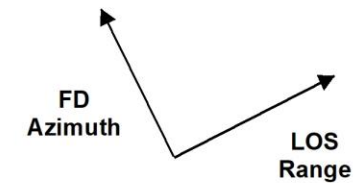
# IV. OUTPUTS

# EARTHQUAKES

# Phase Map of the 22 April 2019 M6.1 Central Luzon Earthquake



Coordinate System: GCS WGS 1984  
Datum: WGS 1984  
Units: Degree



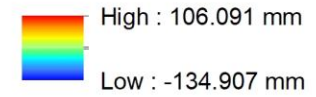
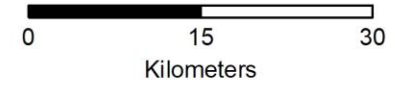
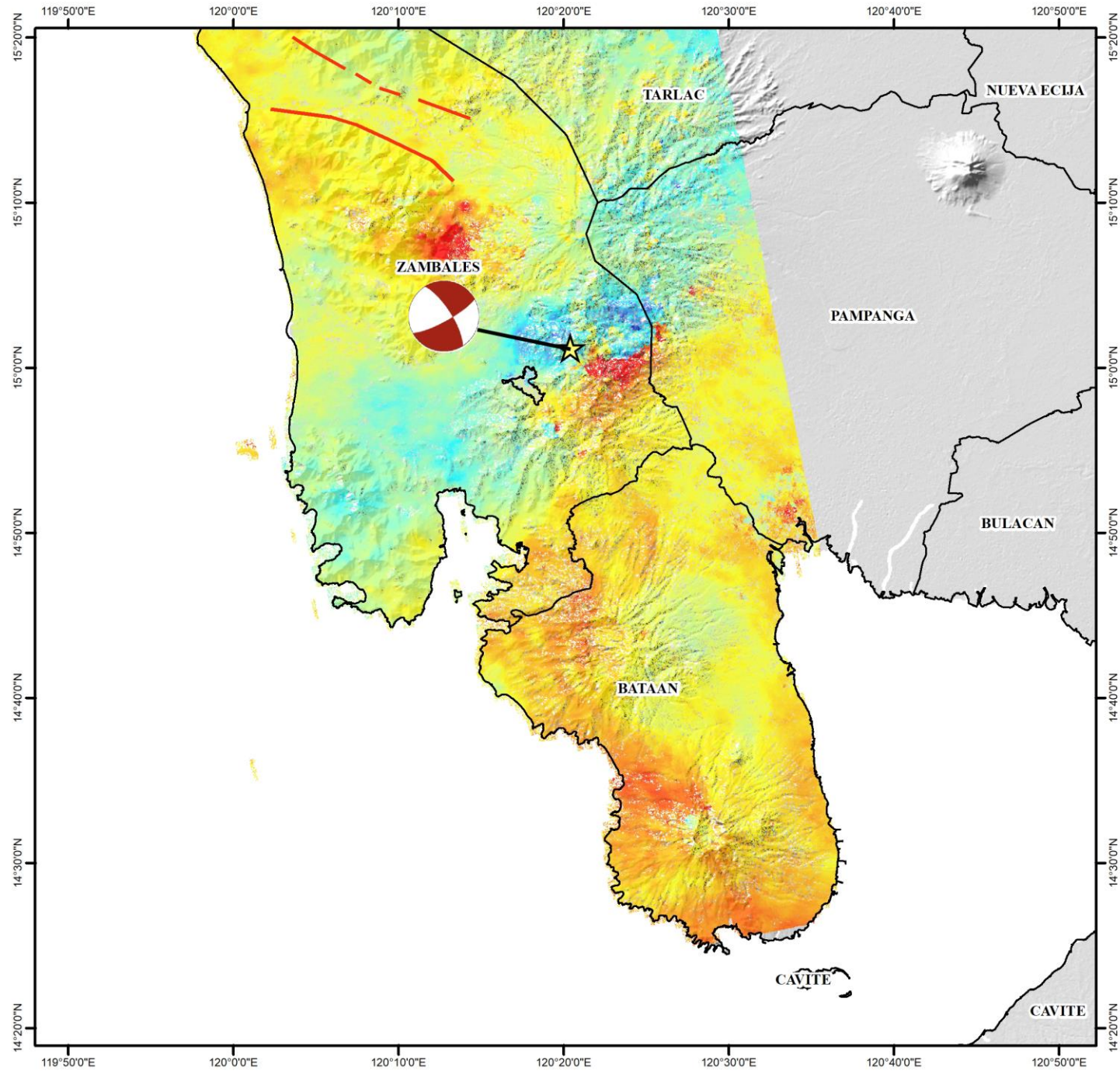
Acquisition Dates: 10 April 2019 (Pre-event)  
22 April 2019 (Post-event)

Processing software: GMTSAR

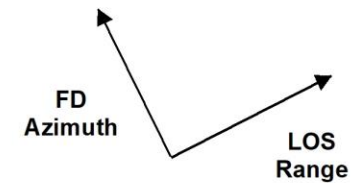
Filters: Topography;  
Power spectrum phase filtering;  
Low coherence masking

Data Source: Sentinel 1B, ESA;  
SRTM-DEM, NASA-JPL; Prov. Boundaries, PSA;  
Active Faults and Focal Mechanism, PHIVOLCS

# Line Of Sight Map of the 22 April 2019 M6.1 Central Luzon Earthquake



Coordinate System: GCS WGS 1984  
Datum: WGS 1984  
Units: Degree



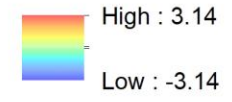
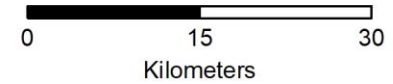
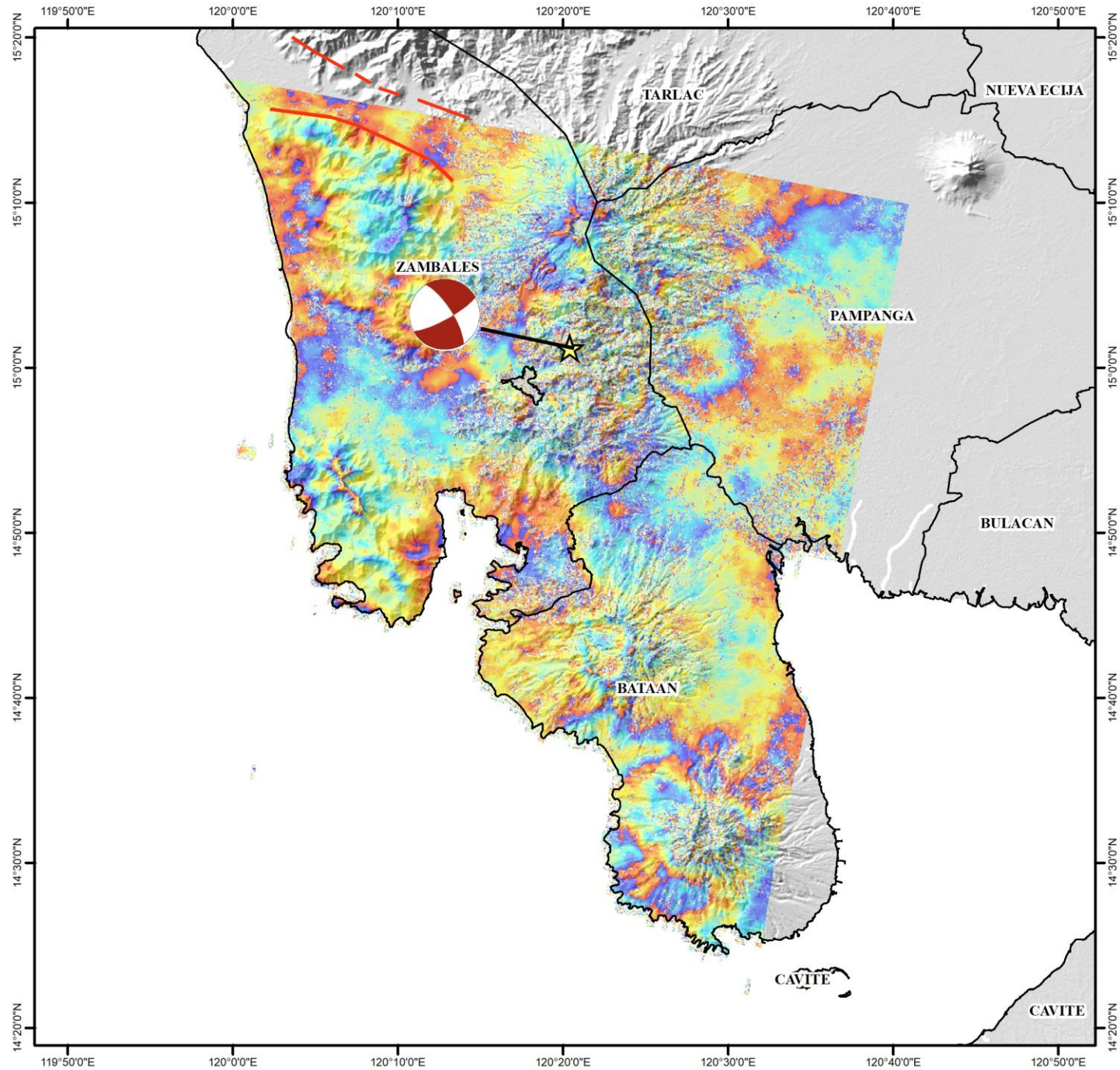
Acquisition Dates: 10 April 2019 (Pre-event)  
22 April 2019 (Post-event)

Processing software: GMTSAR

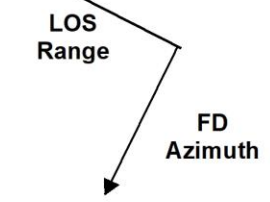
Filters: Topography;  
Power spectrum phase filtering;  
Low coherence masking

Data Source: Sentinel 1B, ESA;  
SRTM, NASA-JPL; Prov. Boundaries, PSA;  
Active Faults and Focal Mechanism, PHIVOLCS

# Phase Map of the 22 April 2019 M6.1 Central Luzon Earthquake



Coordinate System: GCS WGS 1984  
Datum: WGS 1984  
Units: Degree



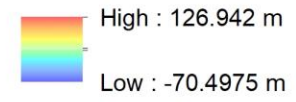
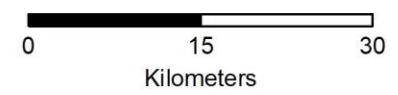
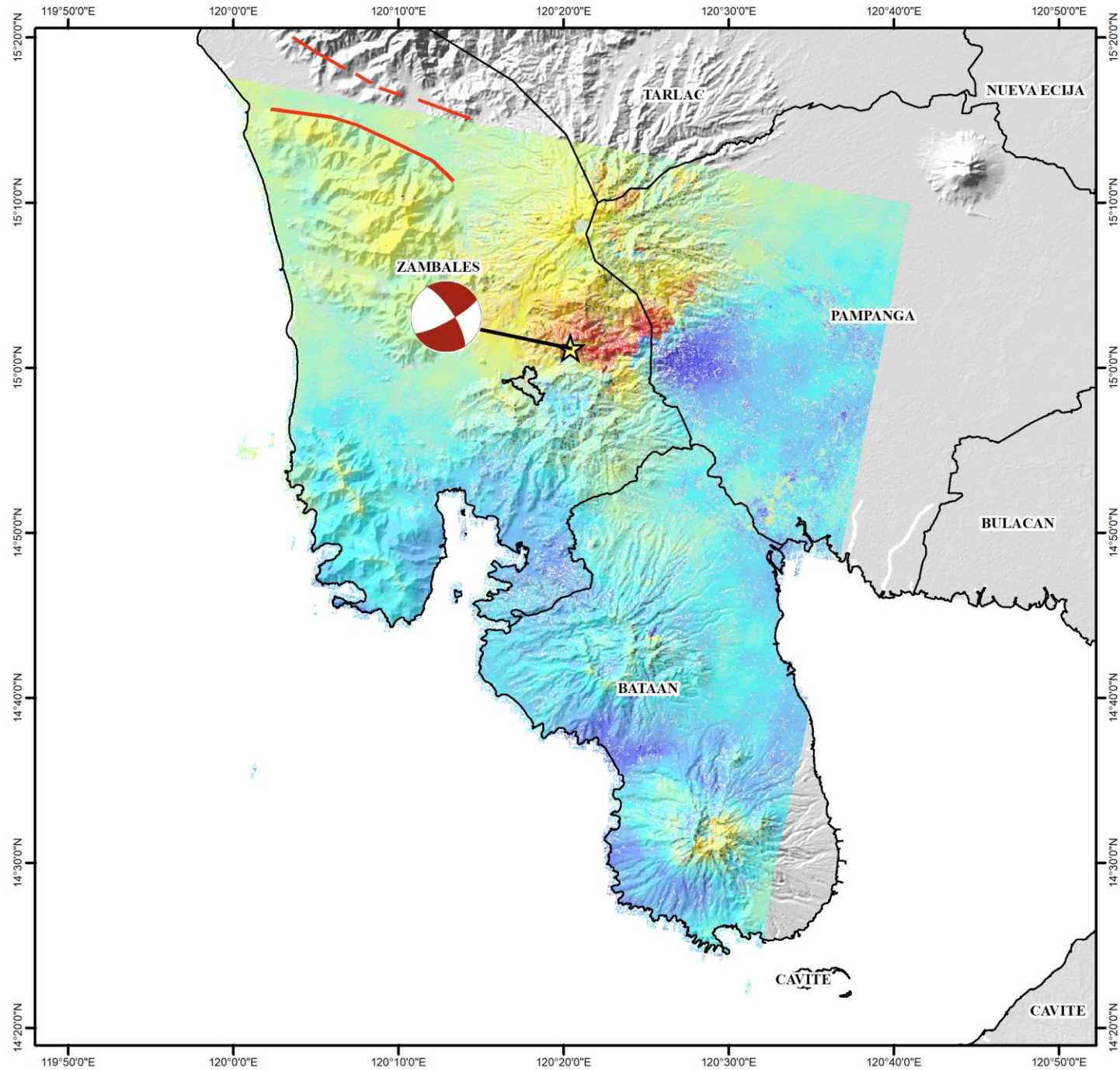
Acquisition Dates: 20 April 2019 (Pre-event)  
02 May 2019 (Post-event)

Processing software: GMTSAR

Filters: Topography;  
Power spectrum phase filtering;  
Low coherence masking

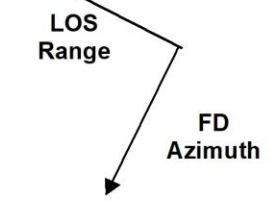
Data Source: Sentinel 1A, ESA;  
SRTM, NASA-JPL; Prov. Boundaries, PSA;  
Active Faults and Focal Mechanism, PHIVOLCS

# Line Of Sight Map of the 22 April 2019 M6.1 Central Luzon Earthquake



☆ Epicenter

Coordinate System: GCS WGS 1984  
Datum: WGS 1984  
Units: Degree



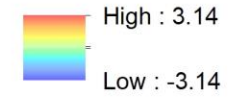
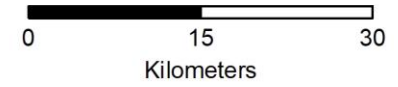
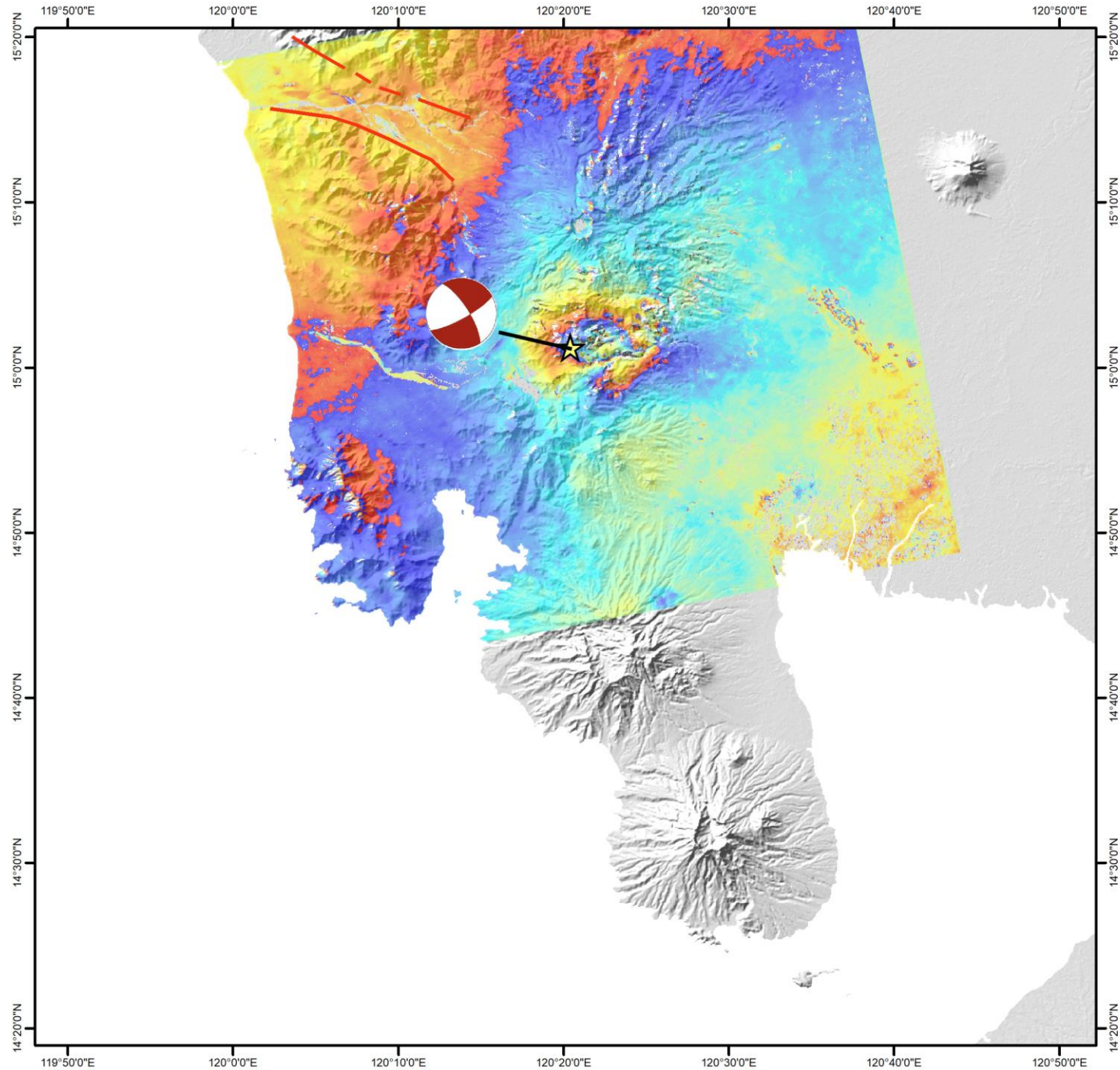
Acquisition Dates: 20 April 2019 (Pre-event)  
02 May 2019 (Post-event)

Processing software: GMTSAR

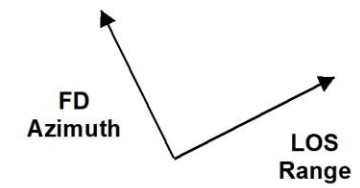
Filters: Topography;  
Power spectrum phase filtering;  
Low coherence masking

Data Source: Sentinel 1A, ESA;  
SRTM, NASA-JPL; Prov. Boundaries, PSA;  
Active Faults and Focal Mechanism, PHIVOLCS

# Phase Map of the 22 April 2019 M6.1 Central Luzon Earthquake



Coordinate System: GCS WGS 1984  
Datum: WGS 1984  
Units: Degree



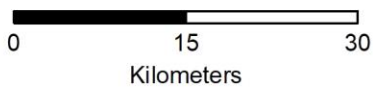
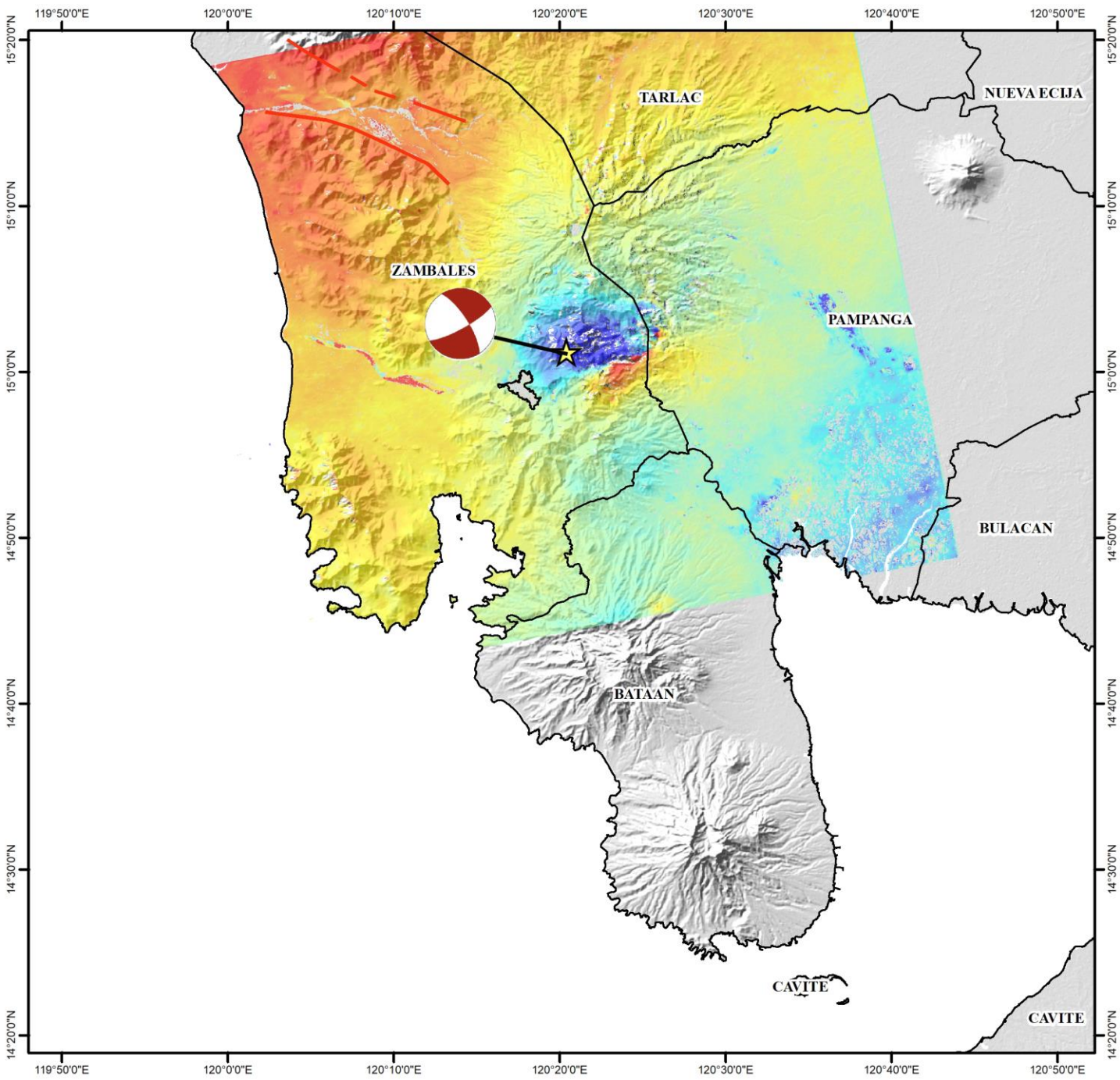
Acquisition Dates: 02 April 2019 (Pre-event)  
30 April 2019 (Post-event)

Processing software: GMTSAR

Filters: Topography;  
Power spectrum phase filtering;  
Low coherence masking

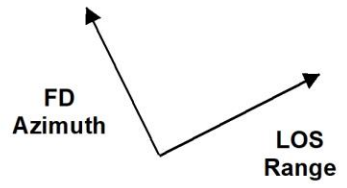
Data Source: ALOS-2, JAXA;  
SRTM, NASA-JPL; Prov. Boundaries, PSA;  
Active Faults and Focal Mechanism, PHIVOLCS

# Line Of Sight Map of the 22 April 2019 M6.1 Central Luzon Earthquake



★ Epicenter

Coordinate System: GCS WGS 1984  
Datum: WGS 1984  
Units: Degree



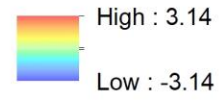
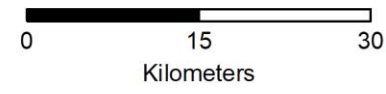
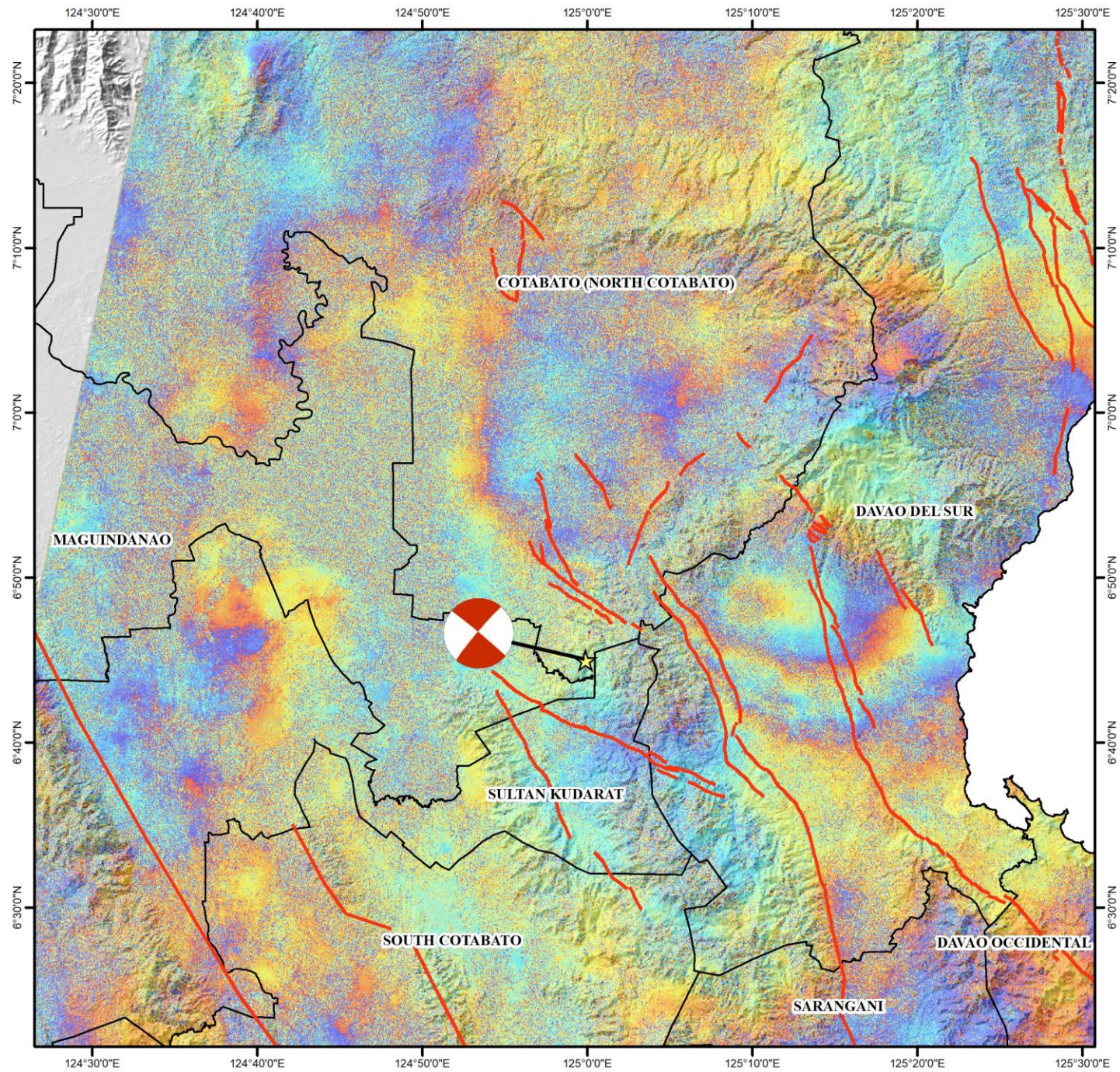
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30 April 2019 (Post-event)

Processing software: GMTSAR

Filters: Topography;  
Power spectrum phase filtering;  
Low coherence masking

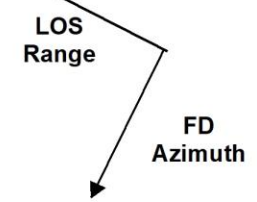
Data Source: ALOS-2, JAXA;  
SRTM, NASA-JPL; Prov. Boundaries, PSA;  
Active Faults and Focal Mechanism, PHIVOLCS

# Phase Map of the 16 October 2019 M6.3 North Cotabato Earthquake



★ Epicenter

Coordinate System: GCS WGS 1984  
Datum: WGS 1984  
Units: Degree



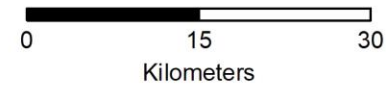
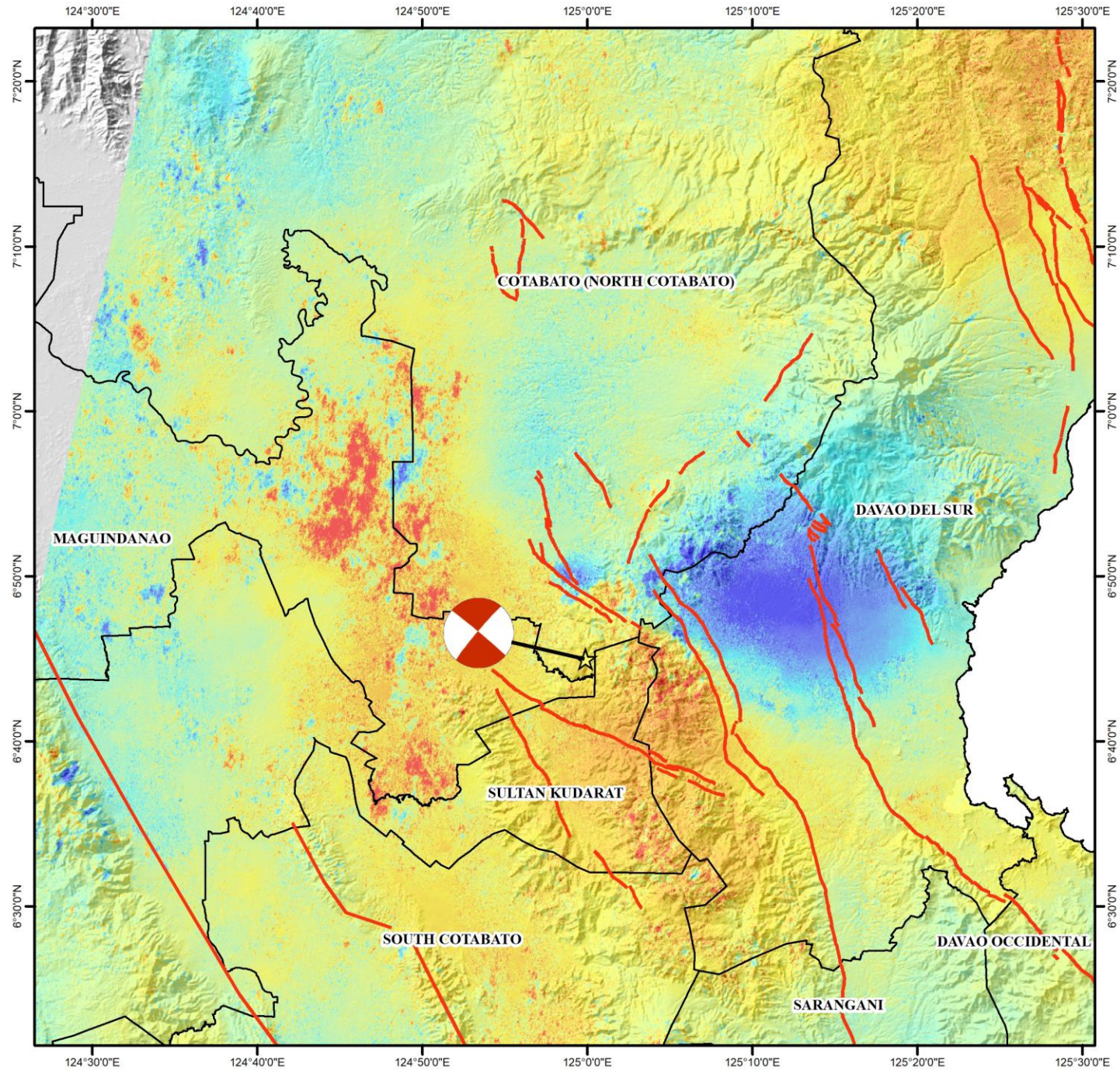
Acquisition Dates: 14 October 2019 (Pre-event)  
26 October 2019 (Post-event)

Processing software: ISCE

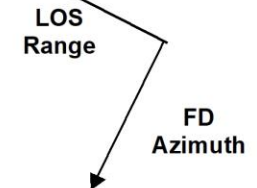
Filters: Topography;  
Power spectrum phase filtering;  
Ionospheric filtering;  
Low coherence masking

Data Source: Sentinel 1A, ESA;  
SRTM, NASA-JPL; Prov. Boundaries, PSA;  
Active Faults and Focal Mechanism, PHIVOLCS

# Line Of Sight Map of the 16 October 2019 M6.3 North Cotabato Earthquake



Coordinate System: GCS WGS 1984  
Datum: WGS 1984  
Units: Degree

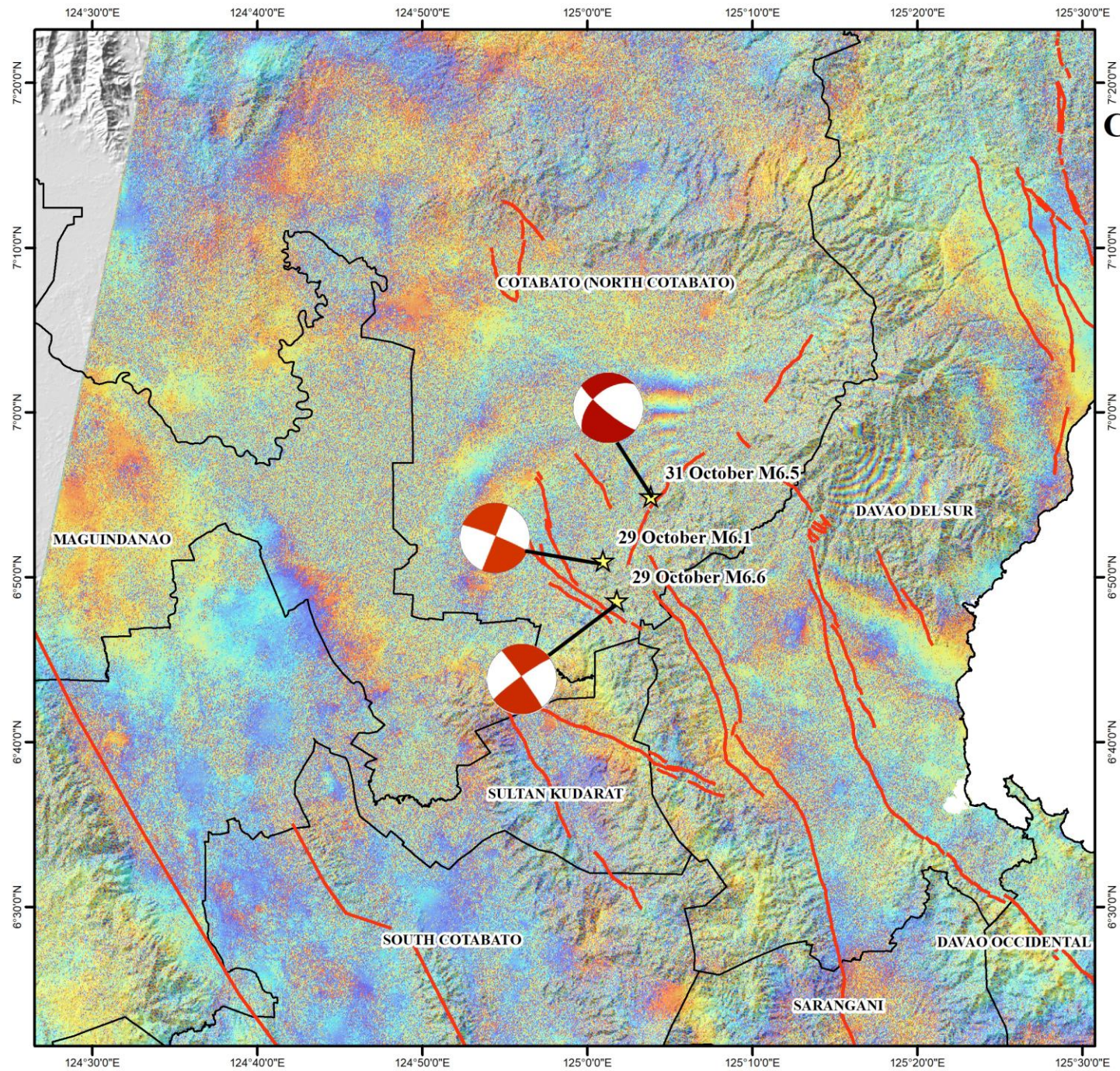


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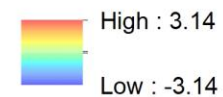
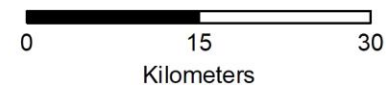
Processing software: ISCE

Filters: Topography;  
Power spectrum phase filtering;  
Ionospheric filtering;  
Low coherence masking

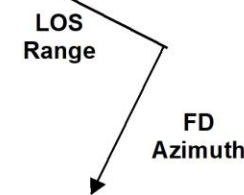
Data Source: Sentinel 1A, ESA;  
SRTM, NASA-JPL; Prov. Boundaries, PSA;  
Active Faults and Focal Mechanism, PHIVOLCS



# Phase Map of the 29-31 October 2019 Cotabato Earthquake Sequence



Coordinate System: GCS WGS 1984  
Datum: WGS 1984  
Units: Degree

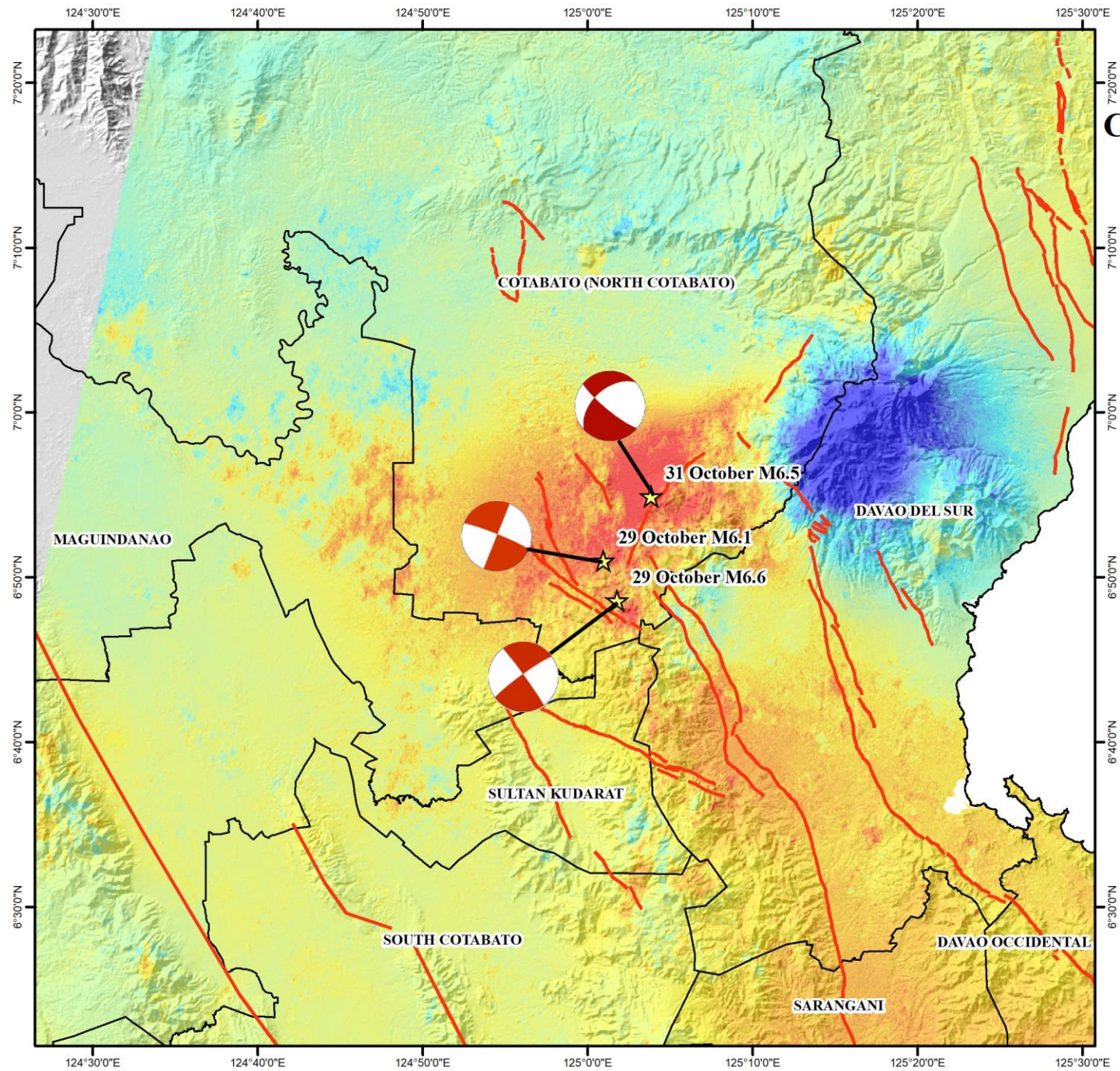


Acquisition Dates: 26 October 2019 (Pre-event)  
07 November 2019 (Post-event)

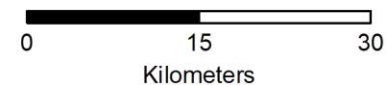
Processing software: ISCE

Filters: Topography;  
Power spectrum phase filtering;  
Ionospheric filtering;  
Low coherence masking

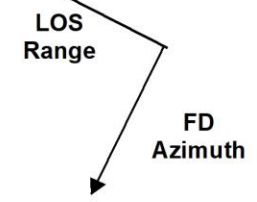
Data Source: Sentinel 1A, ESA;  
SRTM, NASA-JPL; Prov. Boundaries, PSA;  
Active Faults and Focal Mechanism, PHIVOLCS



# Line Of Sight Map of the 29-31 October 2019 Cotabato Earthquake Sequence



Coordinate System: GCS WGS 1984  
Datum: WGS 1984  
Units: Degree



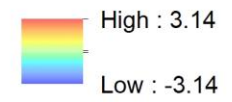
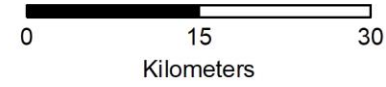
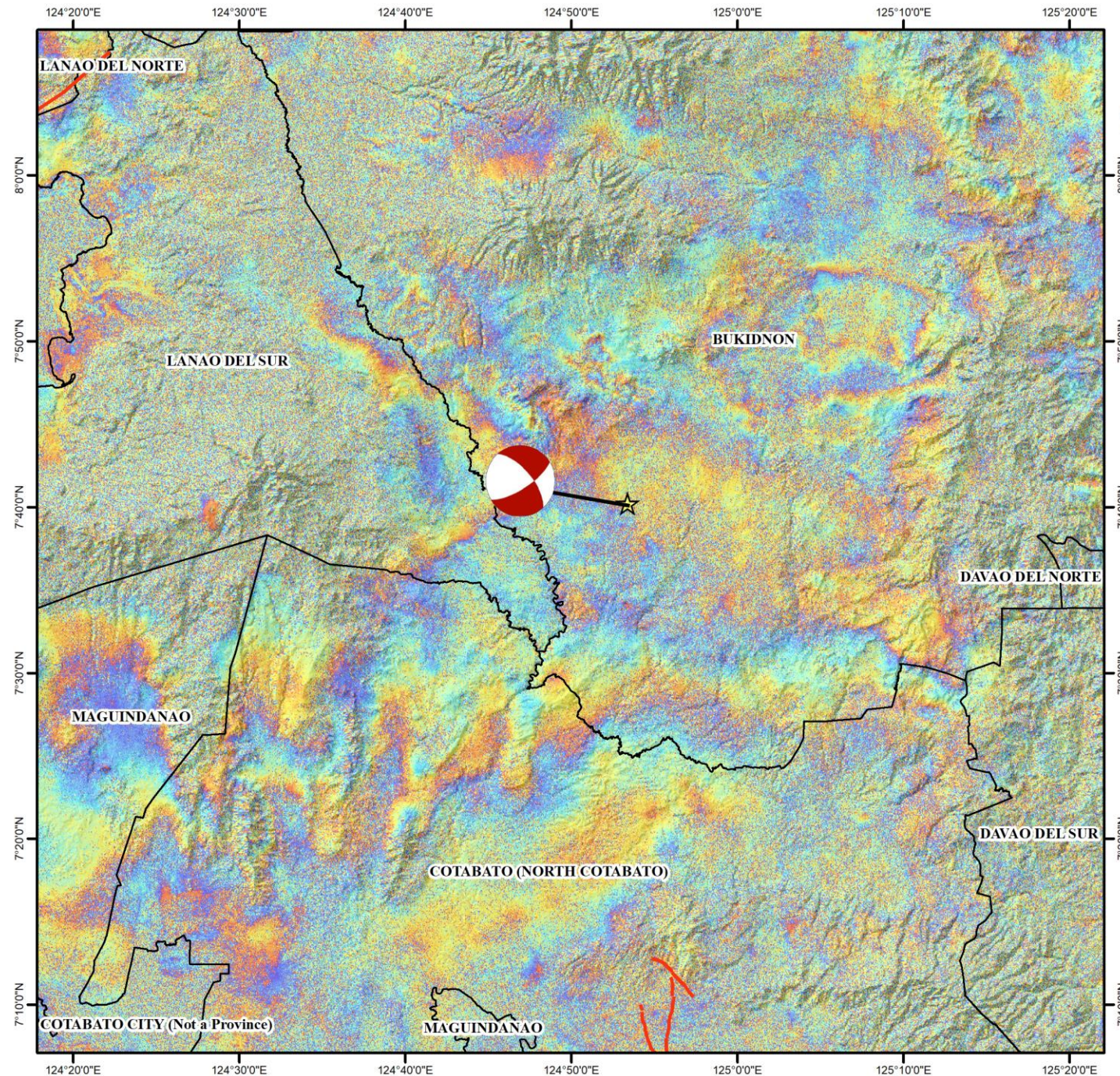
Acquisition Dates: 26 October 2019 (Pre-event)  
07 November 2019 (Post-event)

Processing software: ISCE

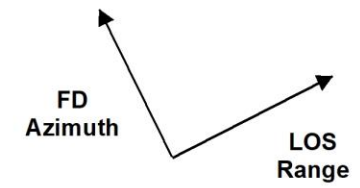
Filters: Topography;  
Power spectrum phase filtering;  
Ionospheric filtering;  
Low coherence masking

Data Source: Sentinel 1A, ESA;  
SRTM, NASA-JPL; Prov. Boundaries, PSA;  
Active Faults and Focal Mechanism, PHIVOLCS

# Phase Map of the 18 November 2019 M5.9 Southern Bukidnon Earthquake



Coordinate System: GCS WGS 1984  
Datum: WGS 1984  
Units: Degree



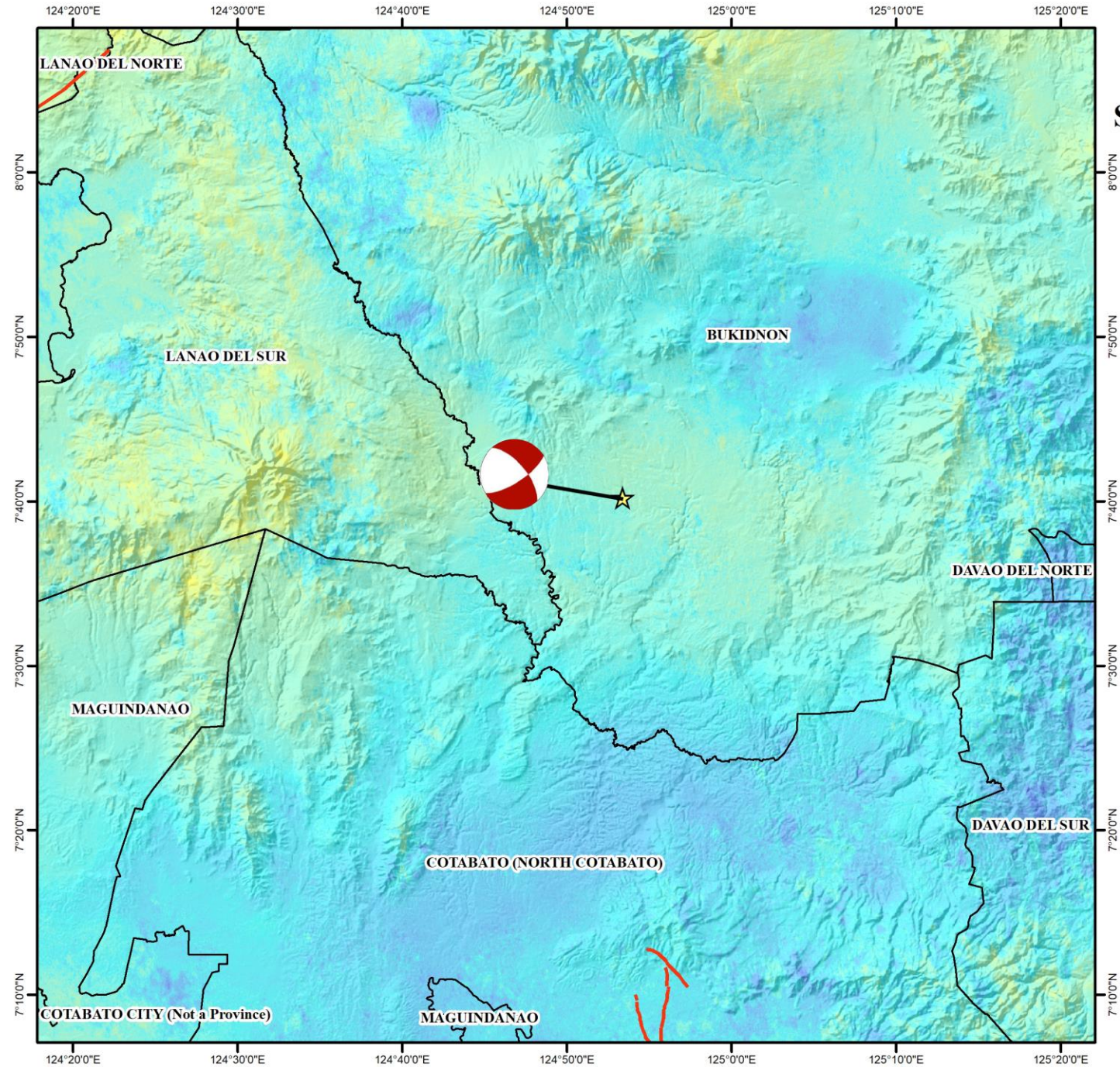
Acquisition Dates: 07 November 2019 (Pre-event)  
19 November 2019 (Post-event)

Processing software: ISCE

Filters: Topography;  
Power spectrum phase filtering;  
Ionospheric filtering;  
Low coherence masking

Data Source: Sentinel 1B, ESA;  
SRTM-DEM, NASA-JPL; Prov. Boundaries, PSA;  
Active Faults and Focal Mechanism, PHIVOLCS

# Line Of Sight Map of the 18 November 2019 M5.9 Southern Bukidnon Earthquake



Kilometers

High : 0 mm



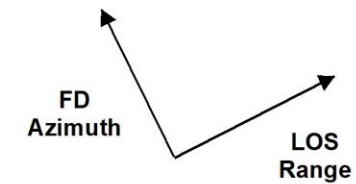
Low : -342.594 mm

★ Epicenter

Coordinate System: GCS WGS 1984

Datum: WGS 1984

Units: Degree



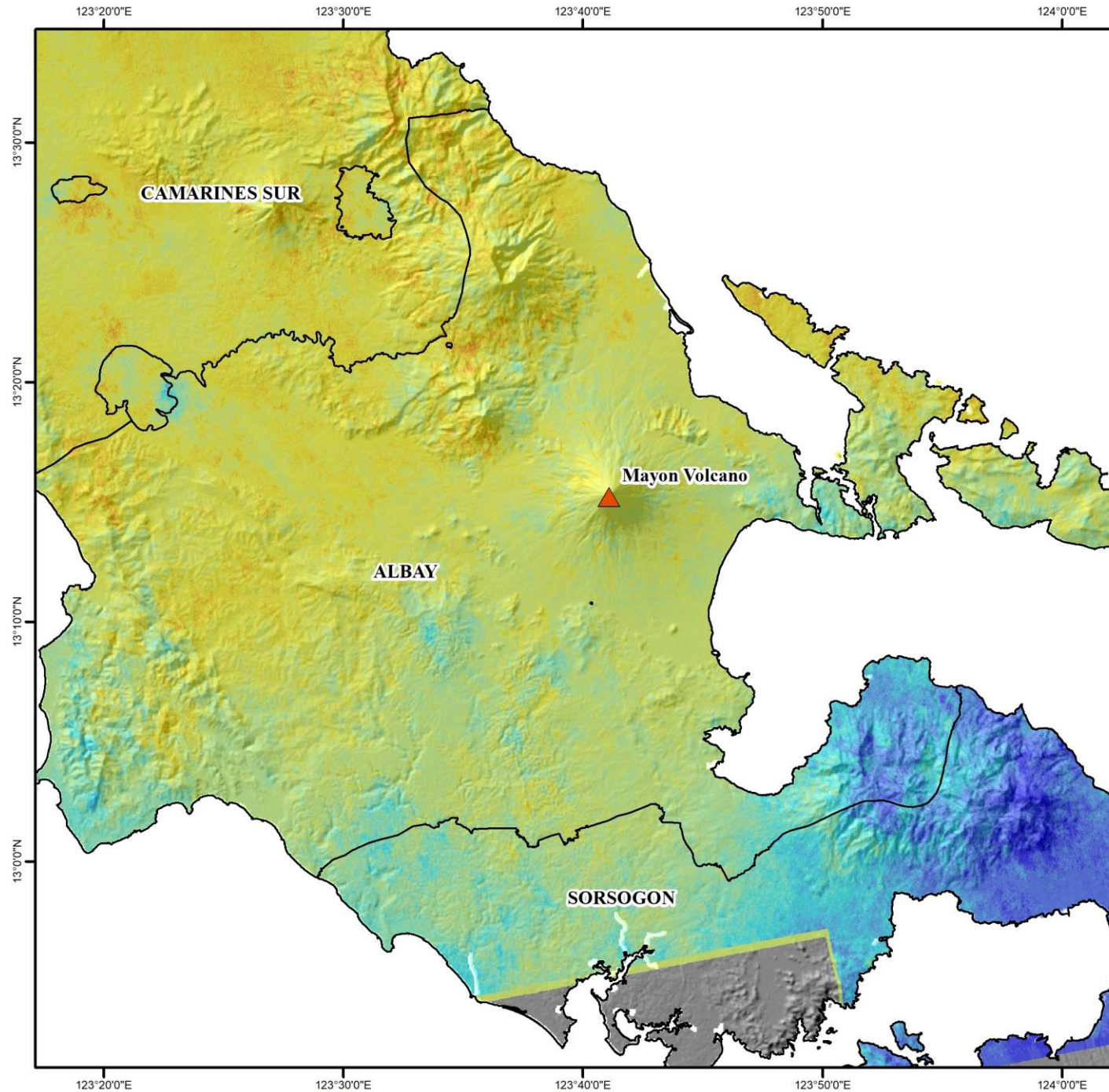
Acquisition Dates: 07 November 2019 (Pre-event)  
19 November 2019 (Post-event)

Processing software: ISCE

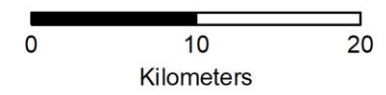
Filters: Topography;  
Power spectrum phase filtering;  
Ionospheric filtering;  
Low coherence masking

Data Source: Sentinel 1B, ESA;  
SRTM-DEM, NASA-JPL; Prov. Boundaries, PSA;  
Active Faults and Focal Mechanism, PHIVOLCS

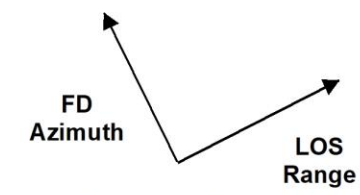
**VOLCANO**



# Time Series Line Of Sight Map of Mayon Volcano



Coordinate System: GCS WGS 1984  
 Datum: WGS 1984  
 Units: Degree



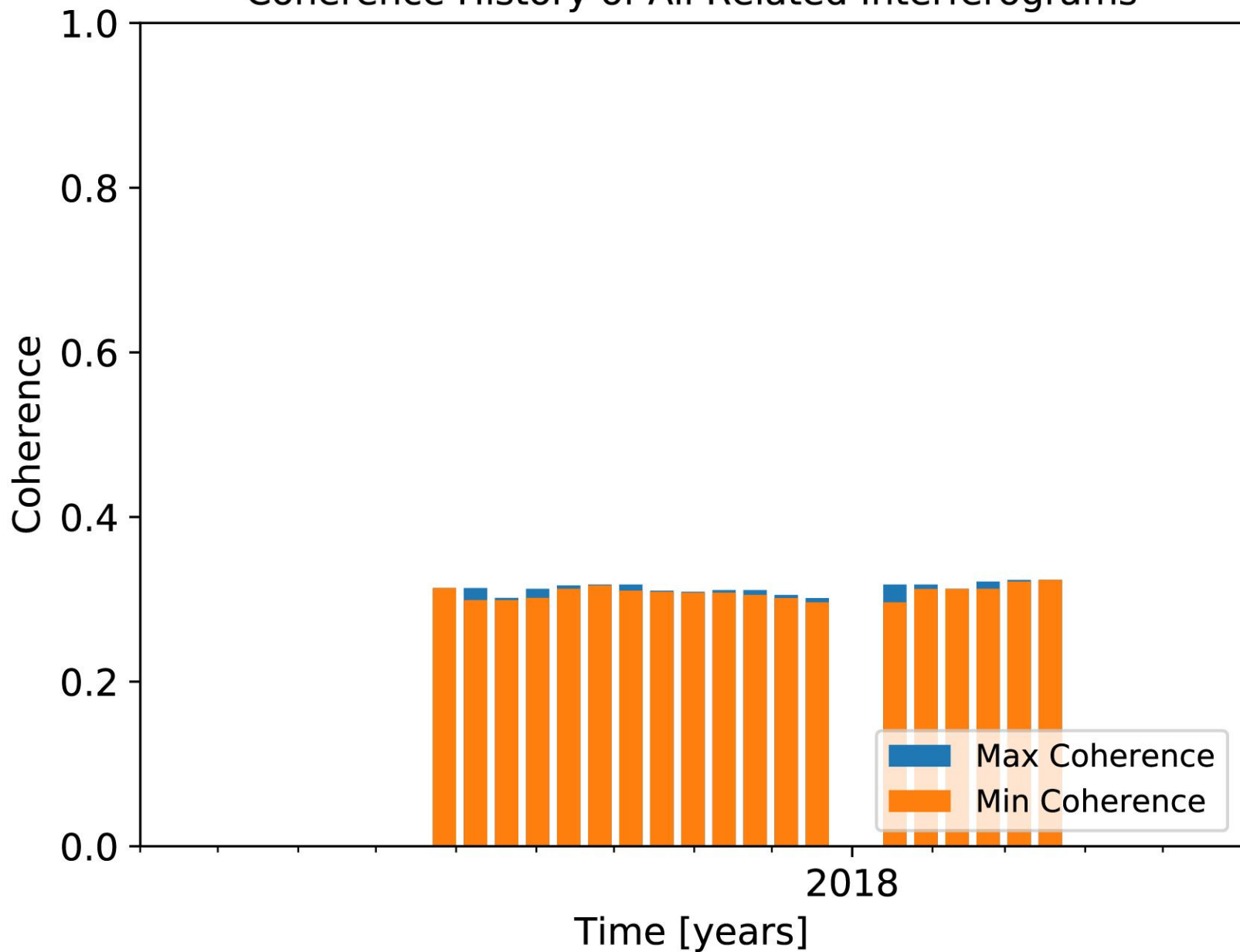
Acquisition Dates: 01 August 2017  
 to 23 March 2018

Processing software: Modified ISCE using NESD approach and MintPy using modified SBAS

Filters: Topography;  
 Power spectrum phase filtering;  
 Low coherence masking;  
 Atmospheric corrections using ERA-5

Data Source: Sentinel 1A & 1B, ESA;  
 SRTM-DEM, NASA-JPL; Prov. Boundaries, PSA;  
 Volcano location, PHIVOLCS

# Coherence History of All Related Interferograms

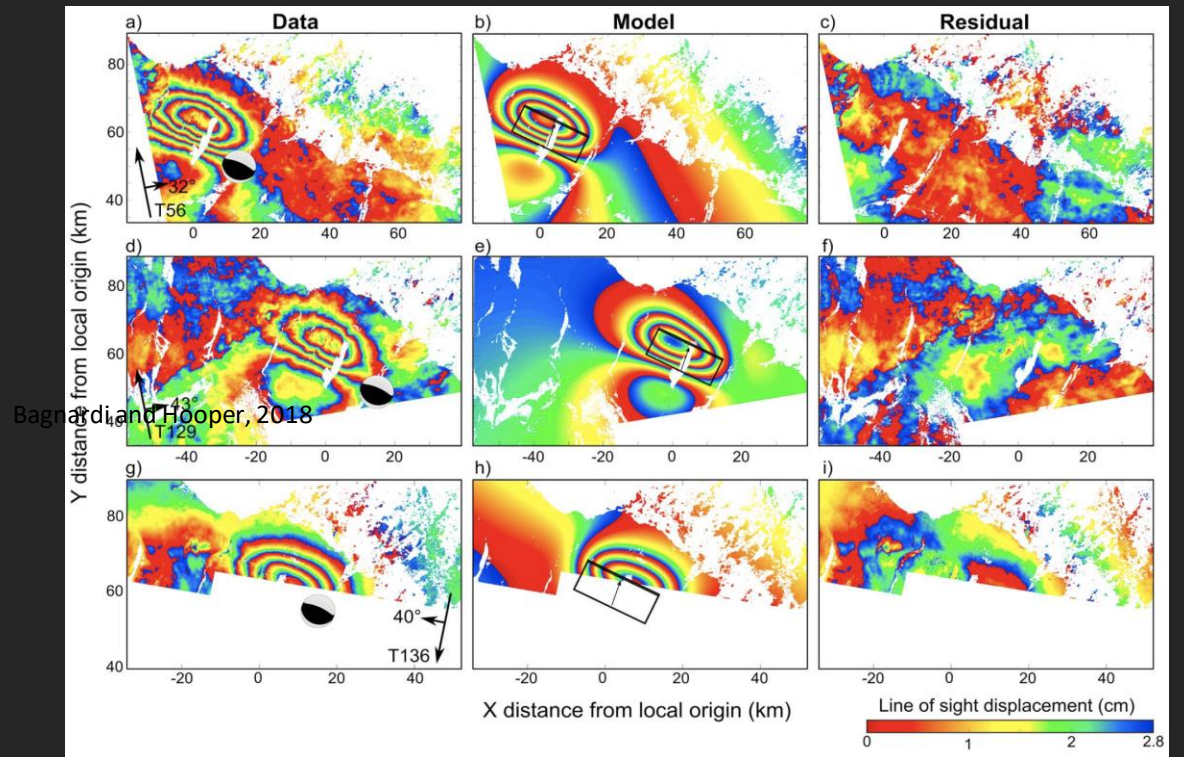


# V. Conclusion

- DInSAR is an effective tool in detecting earthquake ground deformation
  - However, sensor limitations, atmospheric conditions and ground manifestation of the earthquake may result to non-detection
- Non-detection of volcano inflation/deflation trend using time-series methods from DInSAR due to low coherence of the interferogram networks
  - Could be improved if L-band satellites (e.g. ALOS-2) are used instead of C-band satellites (e.g. Sentinel 1) which are more sensitive to ground deformation

# VII. Way Forward

- Forward modeling using known earthquake parameters to properly constrain the interferogram related to the earthquake
- Acquire ALOS-2 satellite data to detect volcano inflation/deflation trend



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THANK YOU FOR  
LISTENING!