

# Systematic InSAR tropospheric phase delay corrections from global meteorological reanalysis data

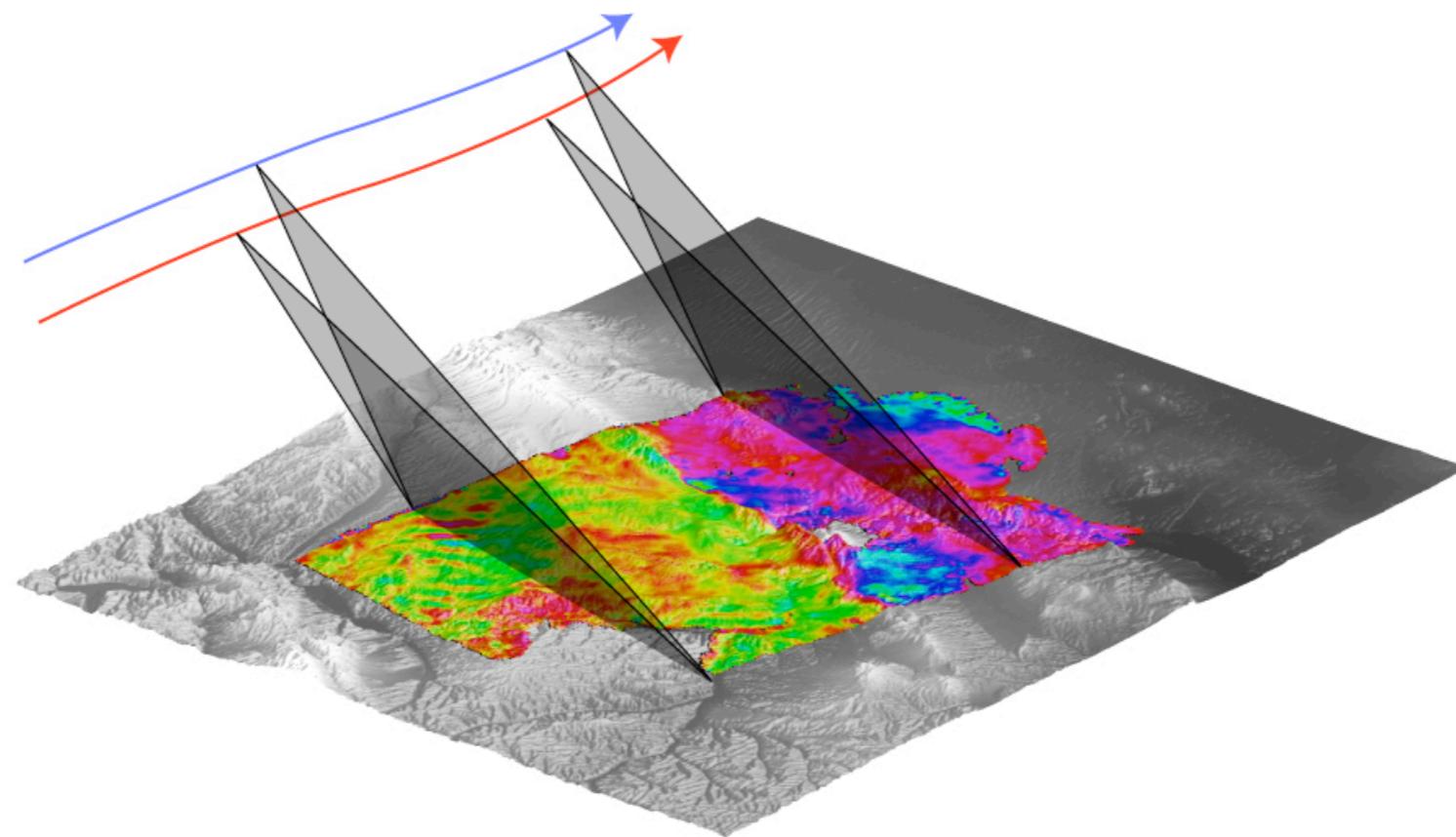
Romain Jolivet<sup>1</sup>, Raphael Grandin<sup>2</sup>, Cécile Lasserre<sup>1</sup>, Marie-Pierre Doin<sup>2</sup> and Gilles Peltzer<sup>3,4</sup>

1: Institut de Sciences de la Terre, Université Joseph Fourier, CNRS, Grenoble, France

2: Laboratoire de Géologie, Ecole Normale Supérieure de Paris, CNRS, France

3: Department of Earth and Space Sciences, University of California, Los Angeles, USA

4: Jet Propulsion Laboratory, California Institute of Technology, Pasadena, USA



Jolivet, R., R. Grandin, C. Lasserre, M.-P. Doin, and G. Peltzer (2011), Systematic InSAR tropospheric phase delay corrections from global meteorological reanalysis data, *Geophys. Res. Lett.*, 38, L17311, doi:10.1029/2011GL048757.

## Atmospheric Phase Screen

$$\Delta\Phi_{(i,j)} = \Delta\phi_{def} + \Delta\phi_{orb} + \boxed{\Delta\phi_{atmo}} + \phi_{noise}$$

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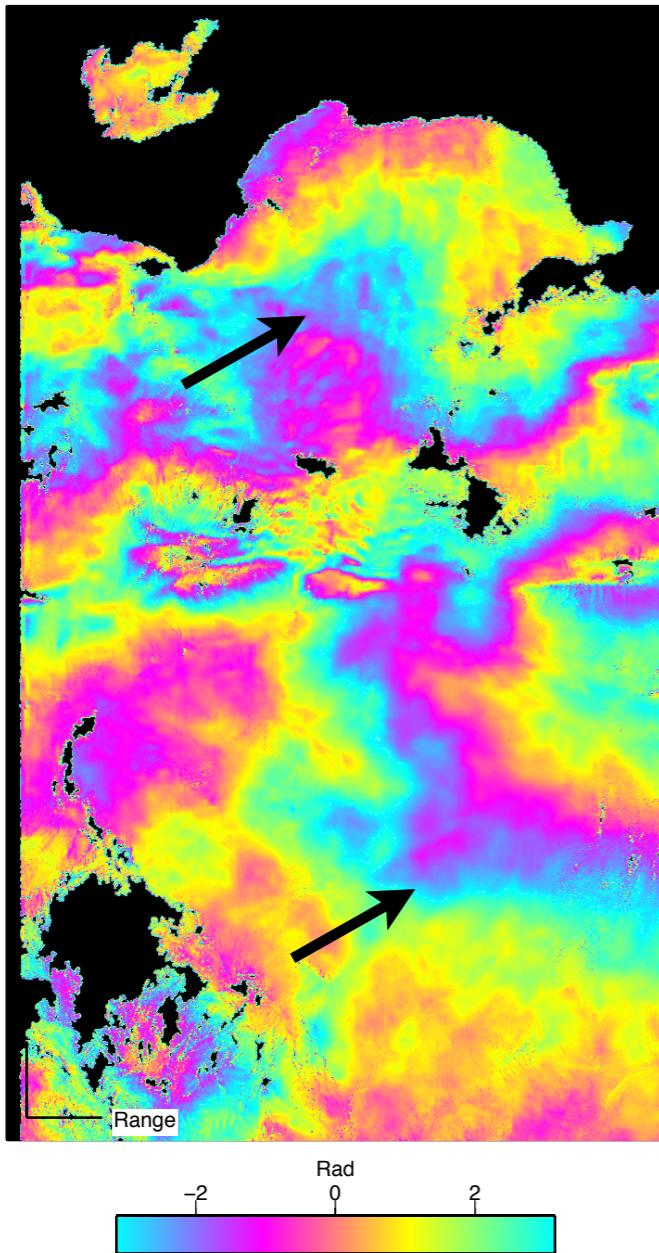
$$\Delta\Phi_{(i,j)} = \Delta\phi_{def} + \Delta\phi_{orb} + \boxed{\Delta\phi_{atmo}} + \phi_{noise}$$

Stratified  
Tropospheric  
Delay

+

Turbulent  
Delay

$\Rightarrow$  Stacking or Time Series



- Random in Space and Time
- Numerous Acquisitions to average or smooth the signal

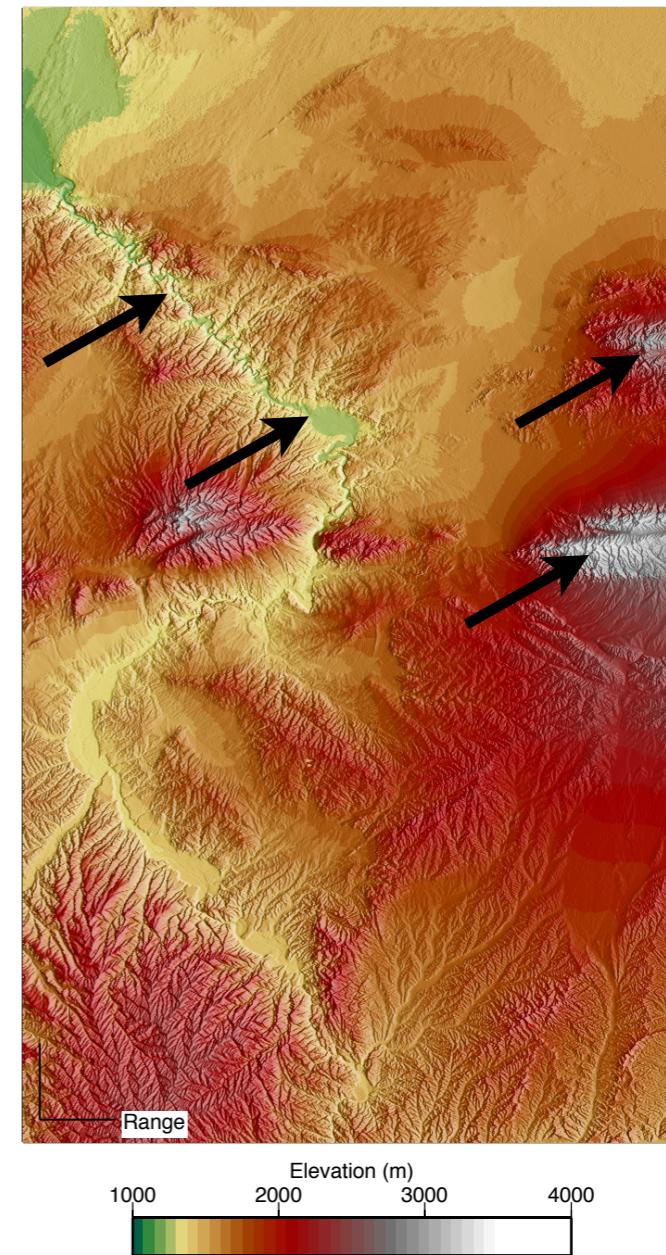
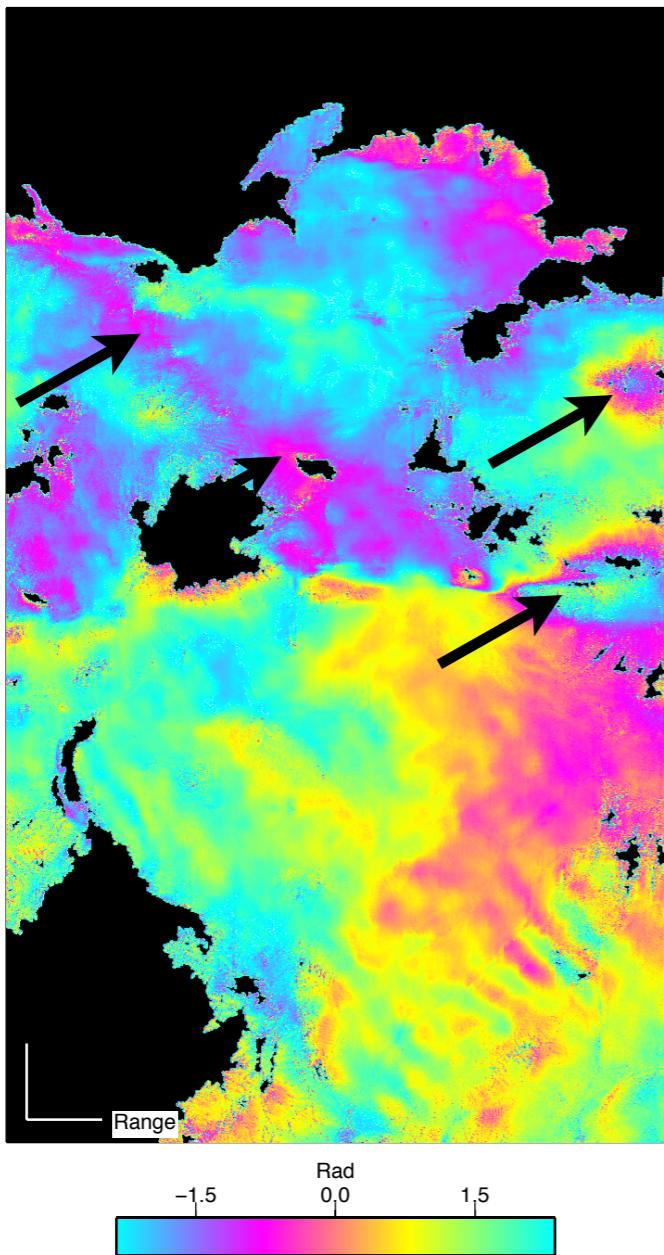
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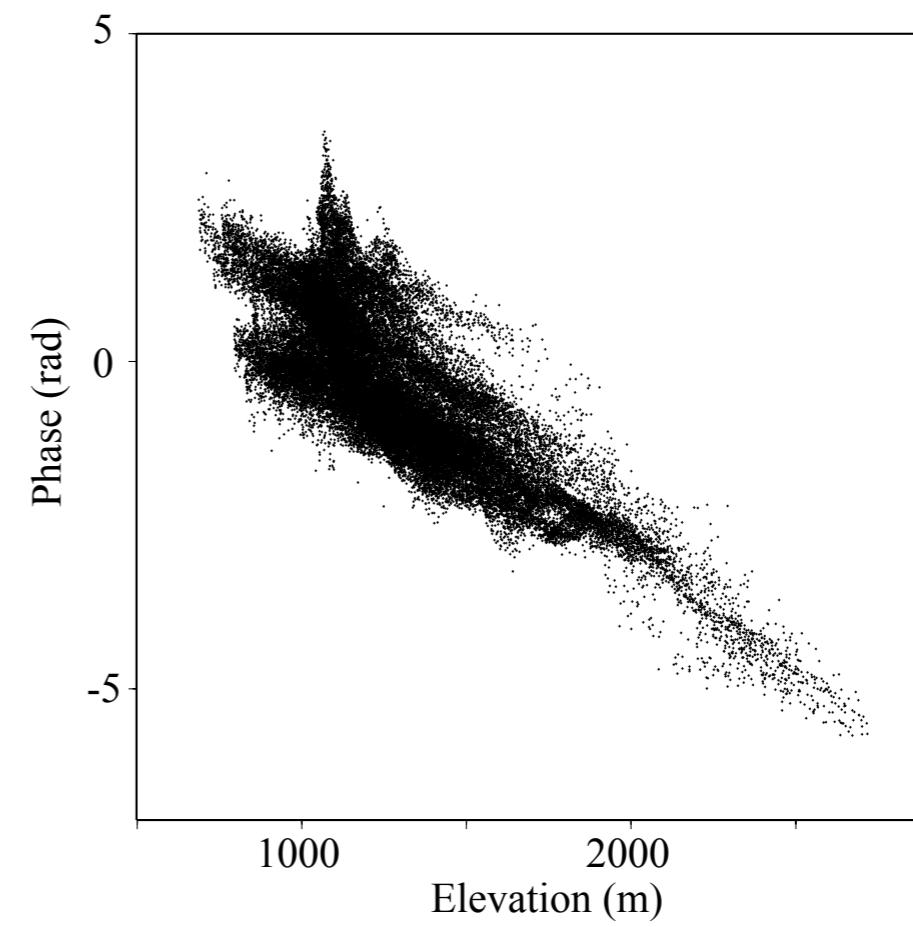
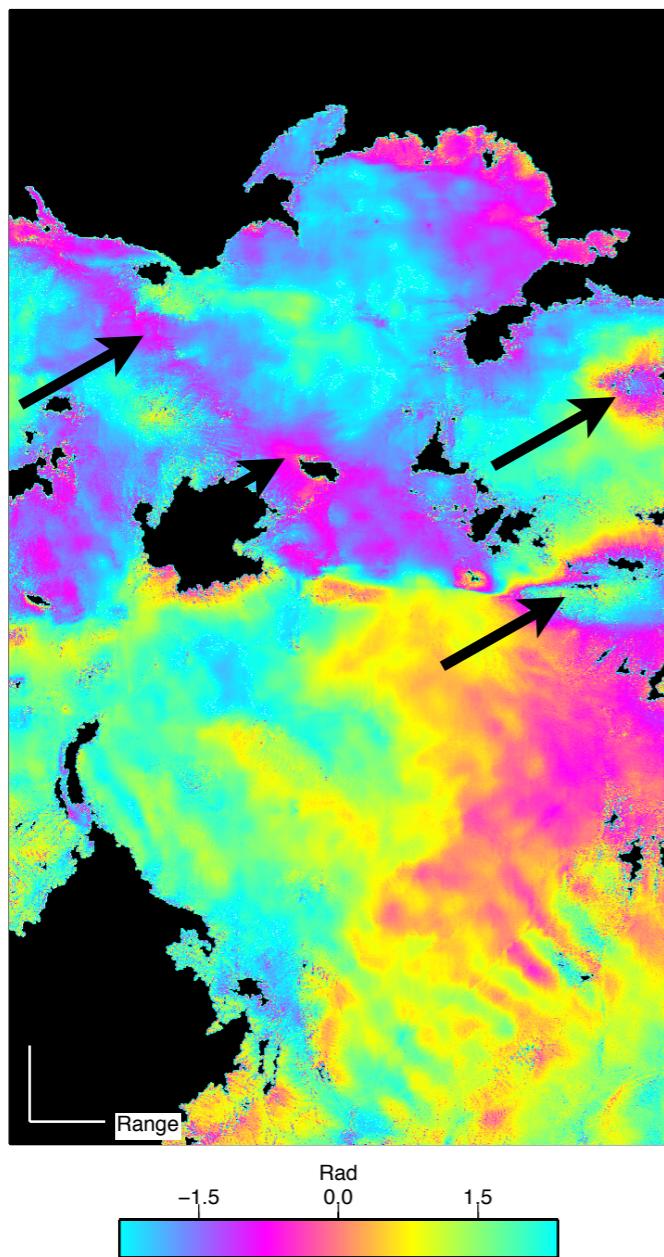
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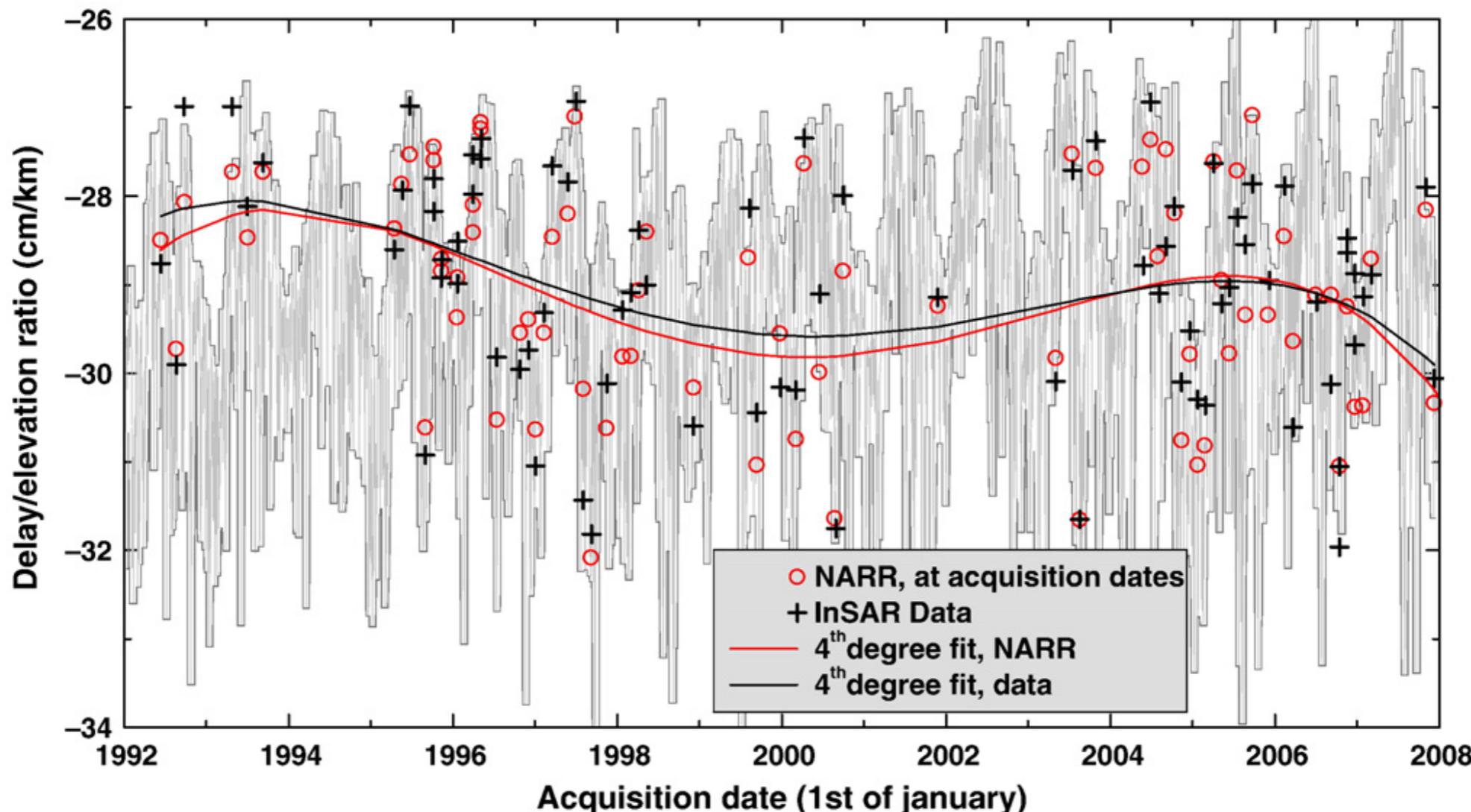
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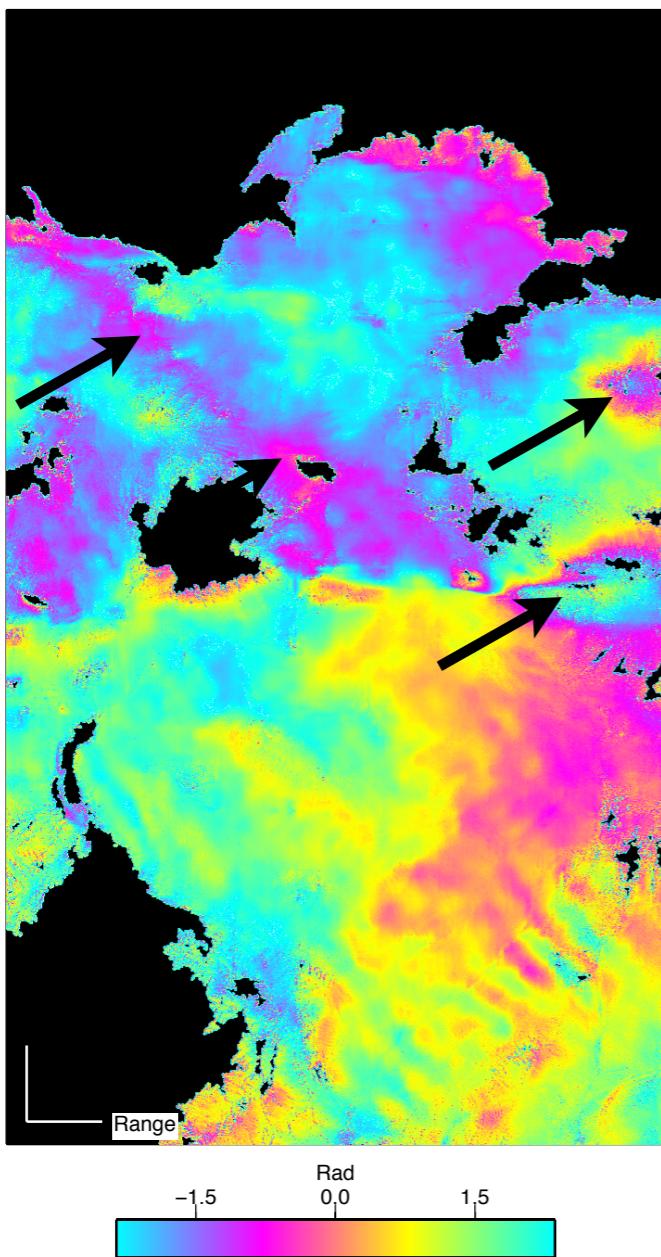
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## Correction methods:

- Local atmospheric data collection e.g. Delacourt et al, 1998
- GPS zenithal delay estimations e.g. Webley et al, 2002; Onn et al, 2006
- Satellite multispectral imagery (ex: MERIS) e.g. Li et al 2006
- Data assimilation in mesoscale meteorological models e.g. Puysegur et al, 2007

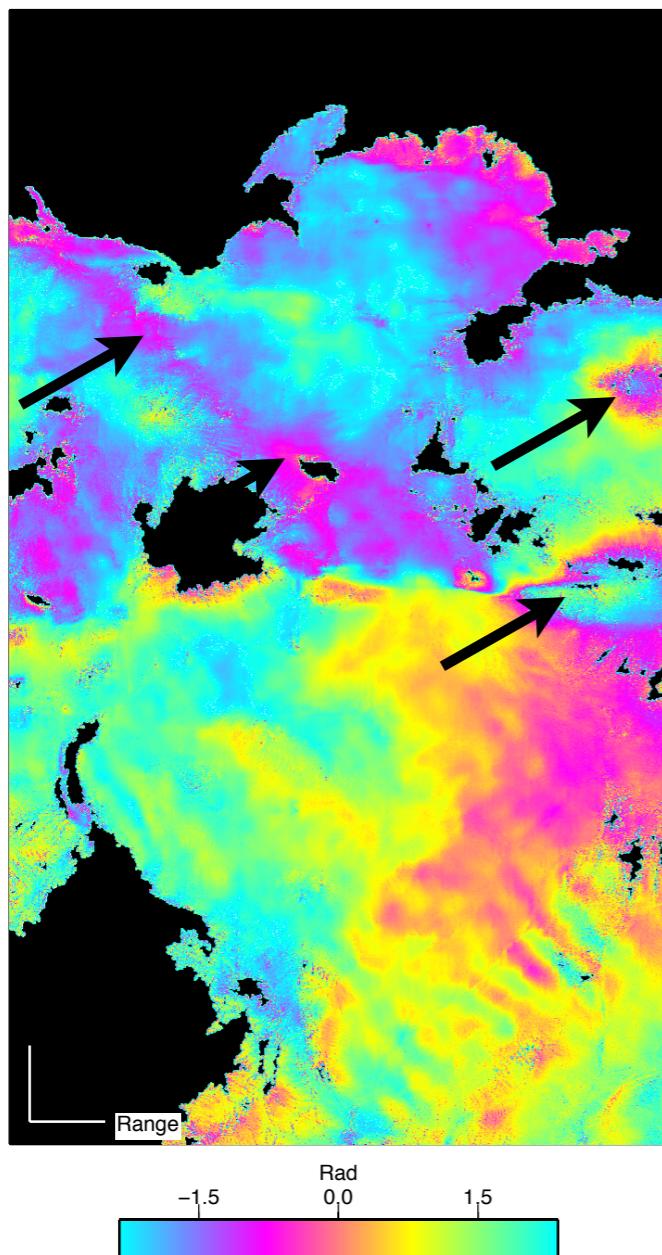
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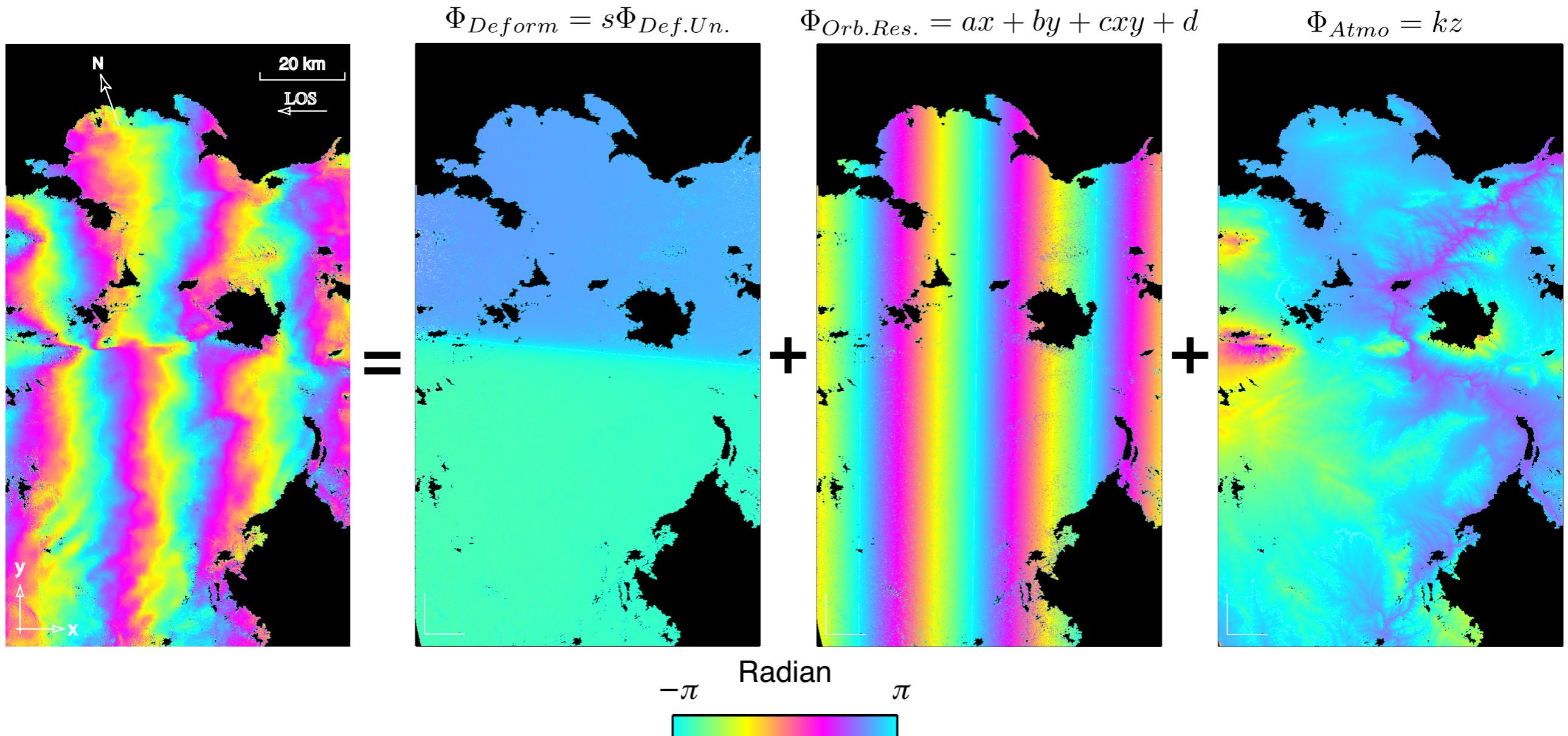
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What if no local data are available?

# Empirical estimation

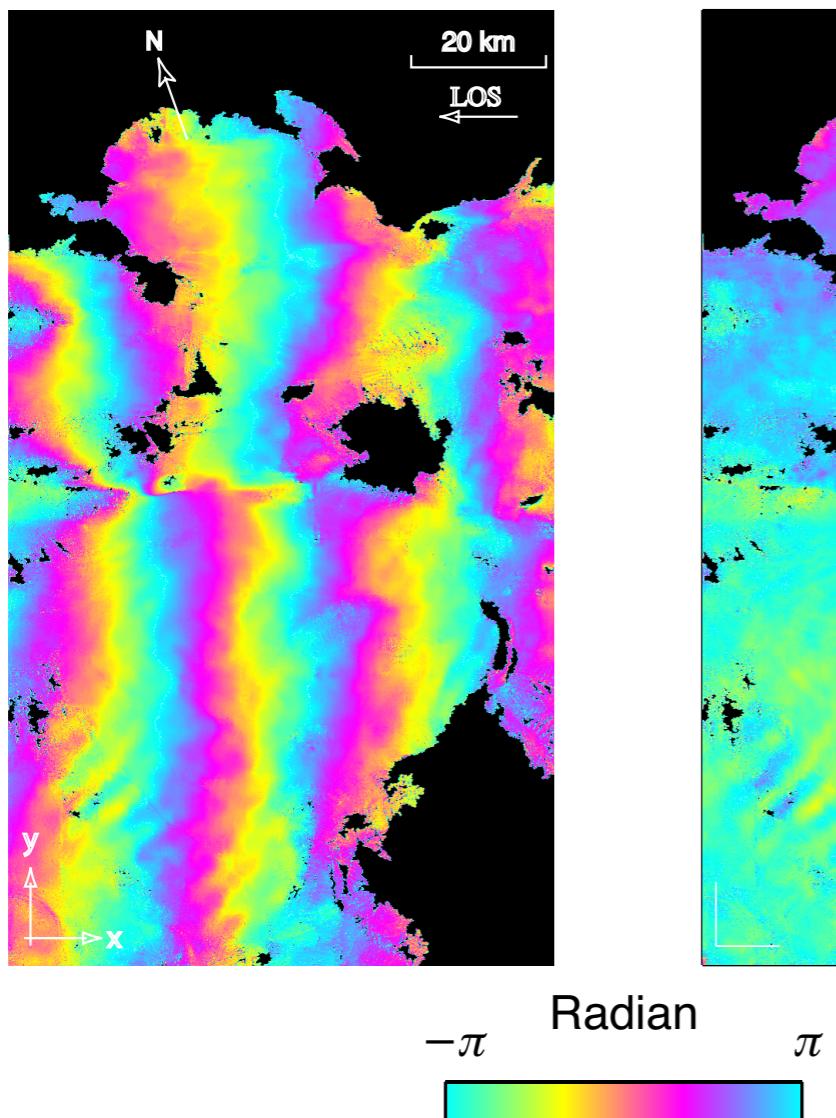
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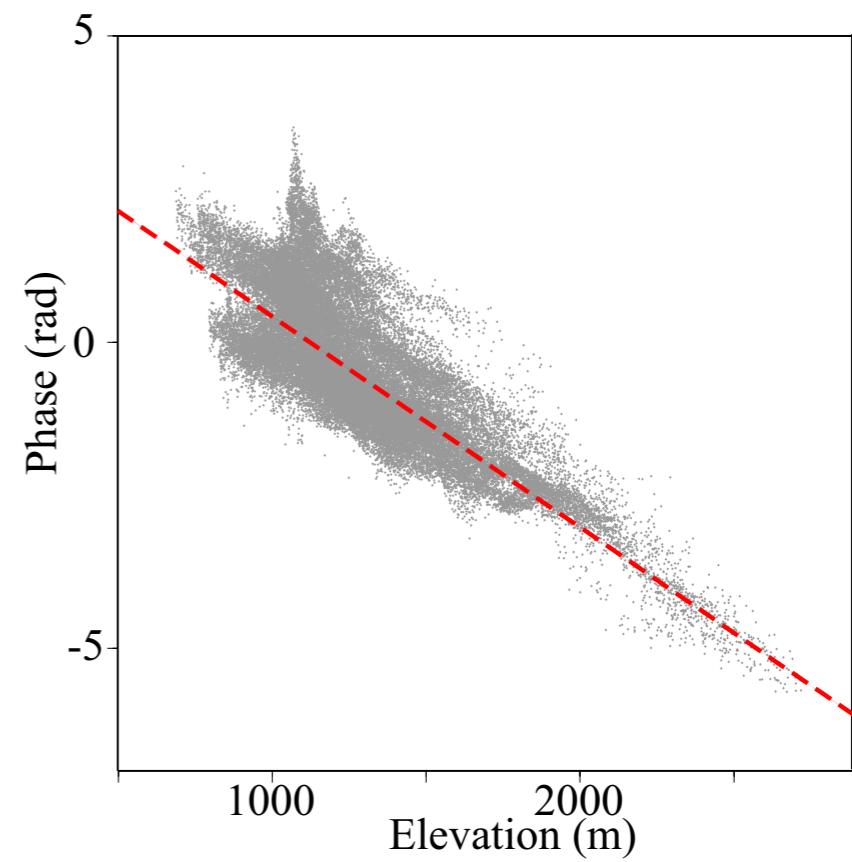
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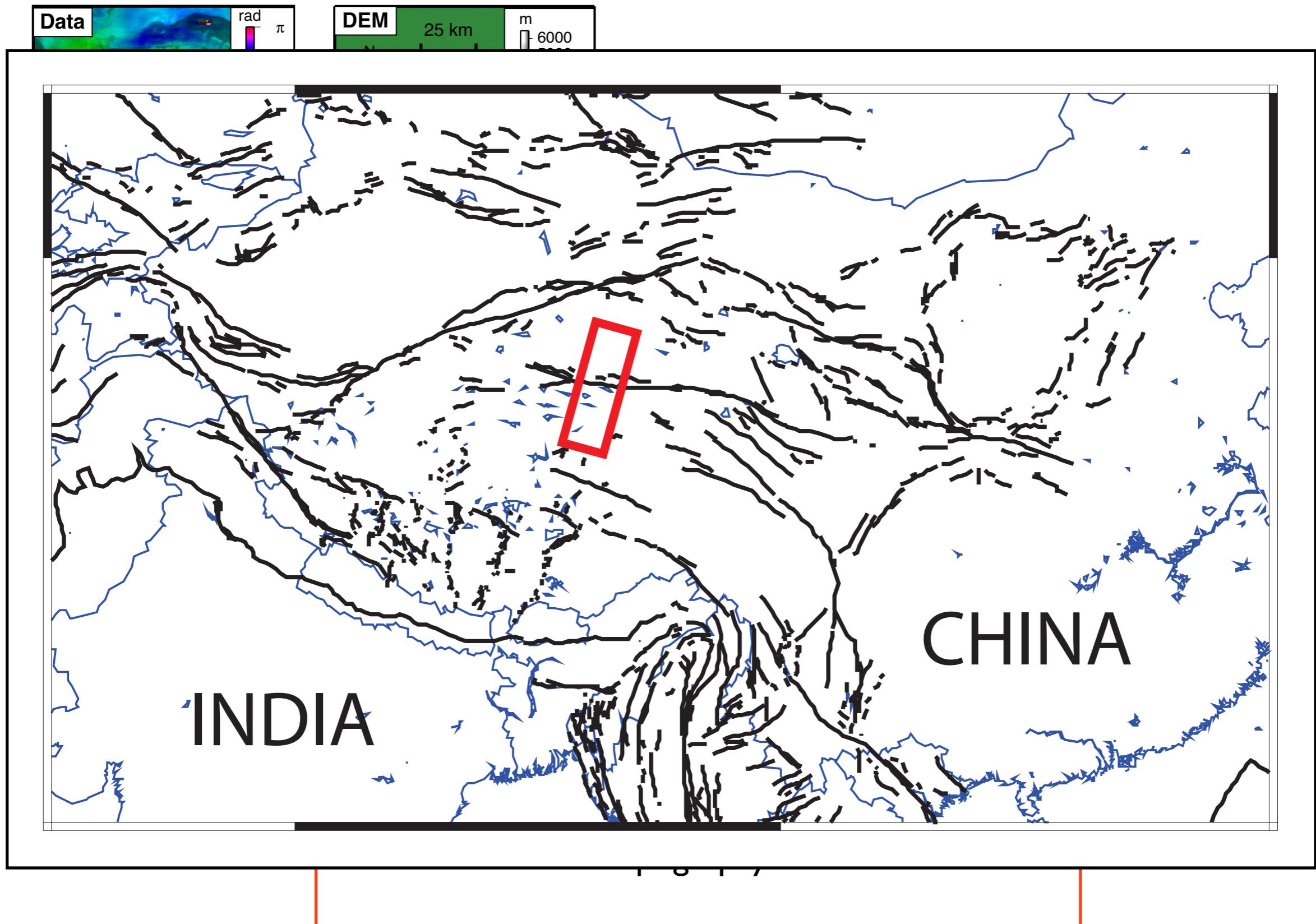
$$\Phi = \Phi_{Deform} + \Phi_{Noise}$$



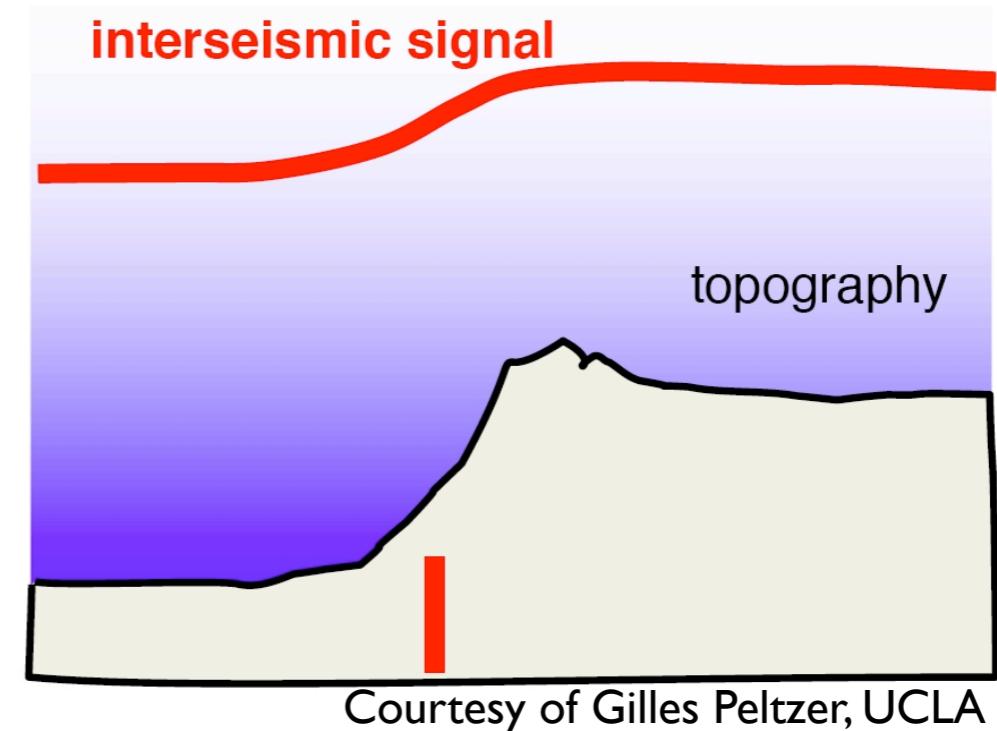
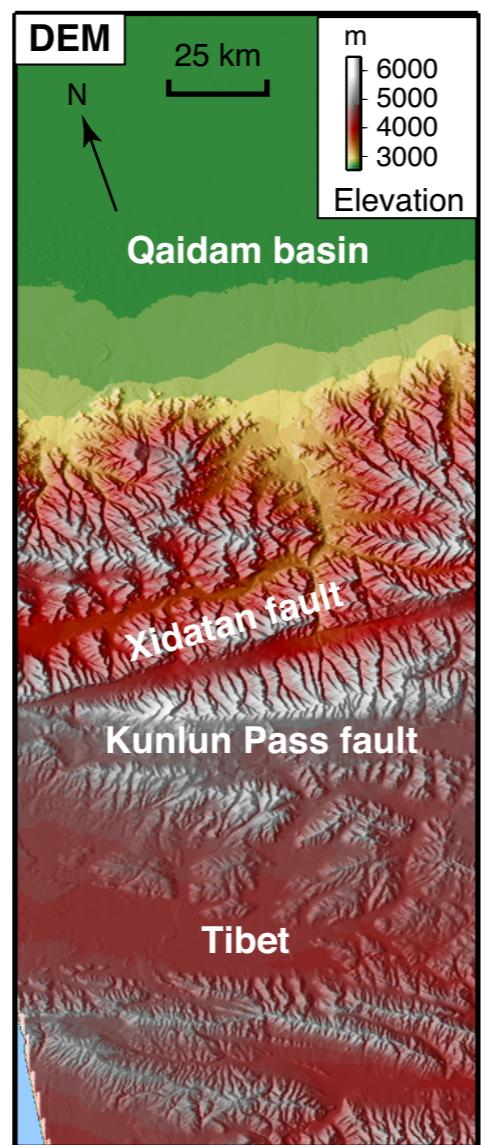
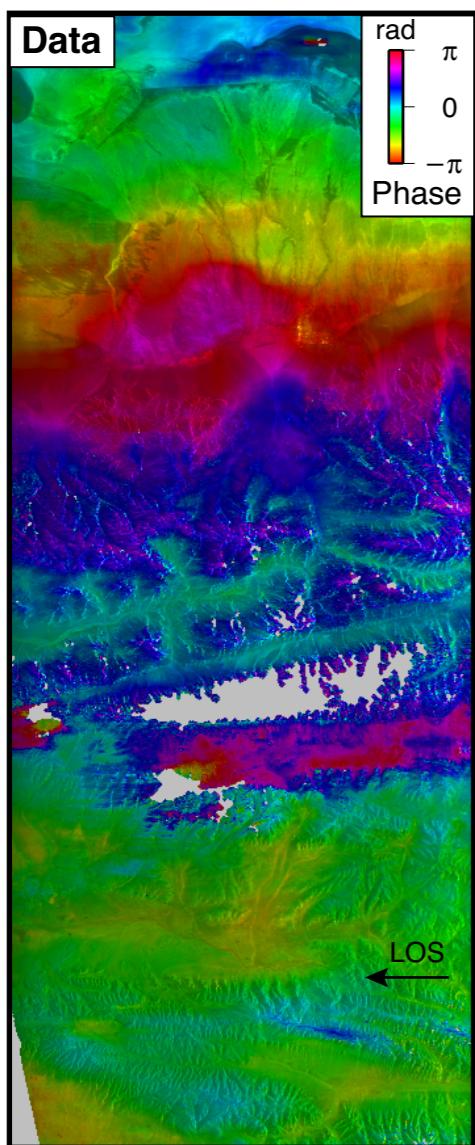
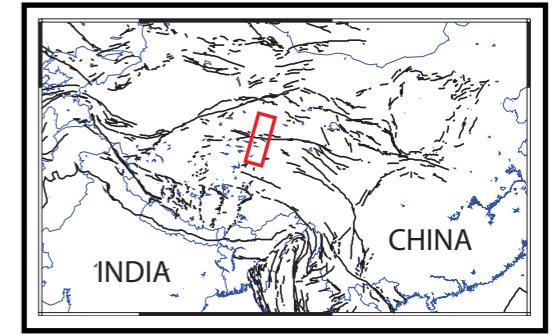
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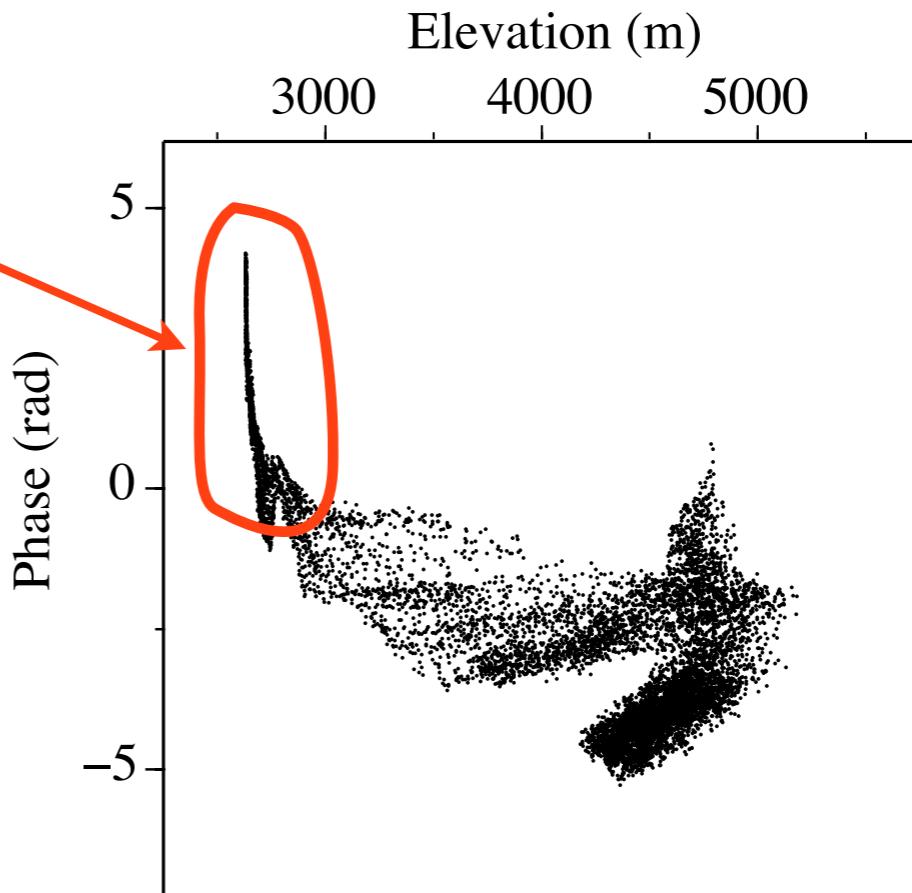
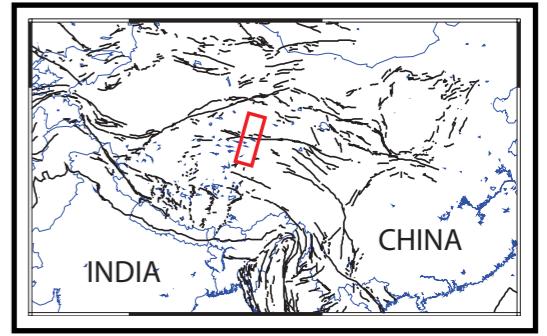
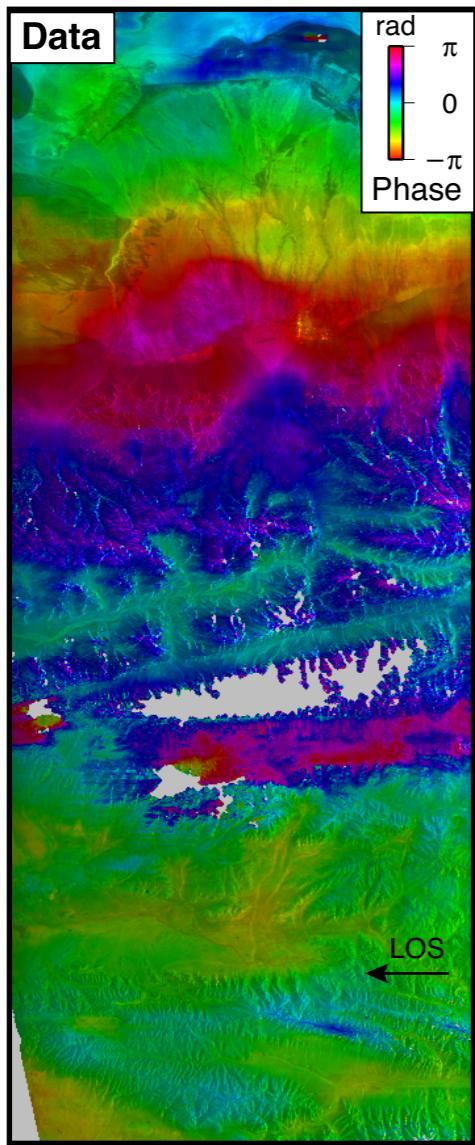
# Empirical estimation but....



Difficult if:

- Deformation and Topography are related

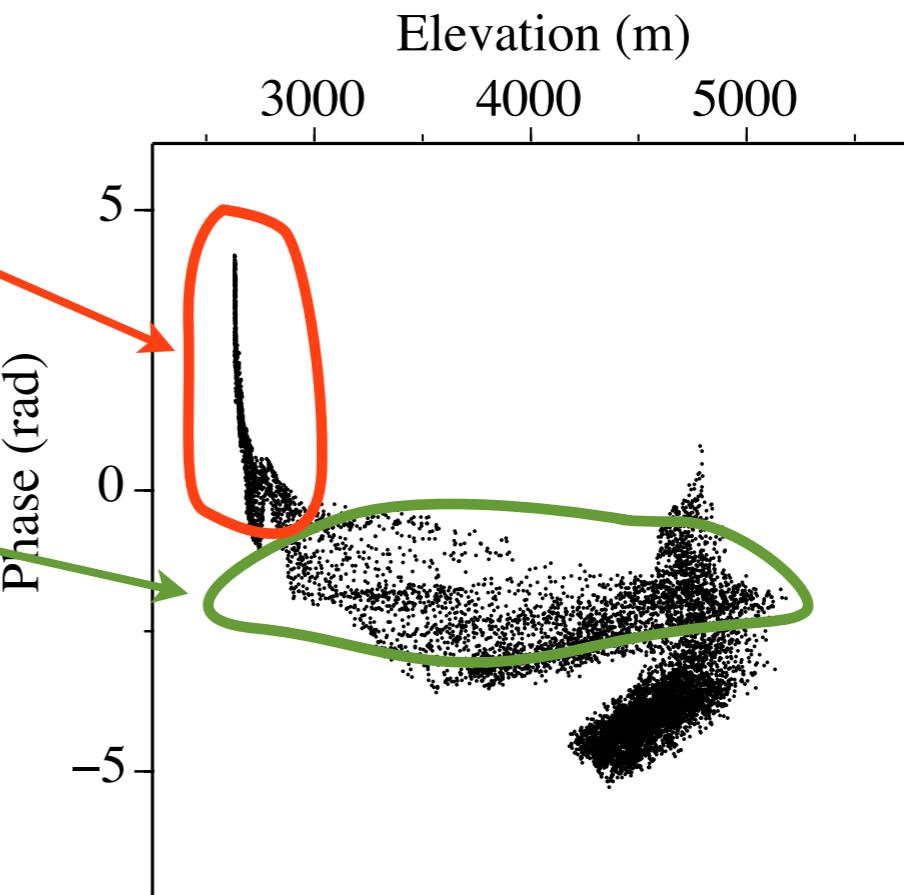
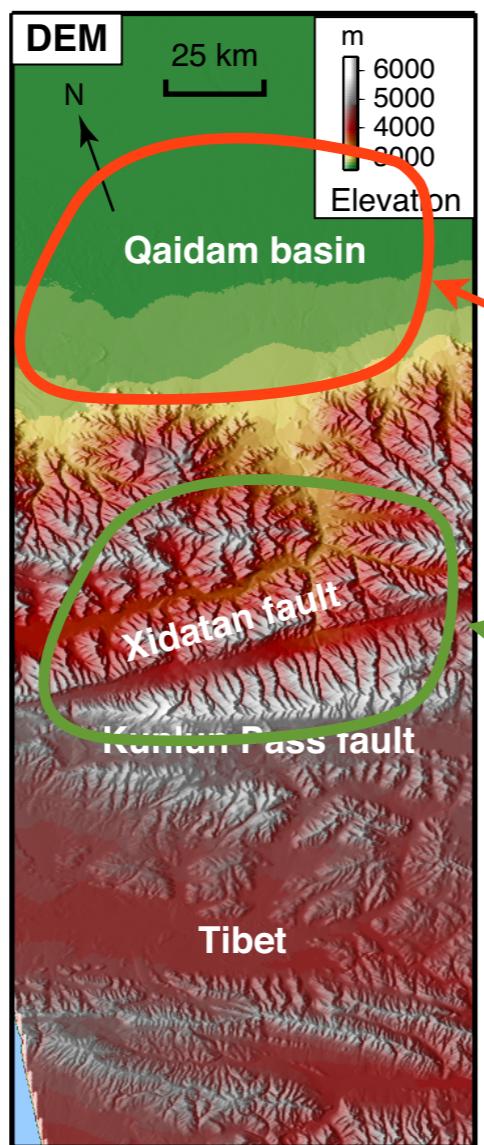
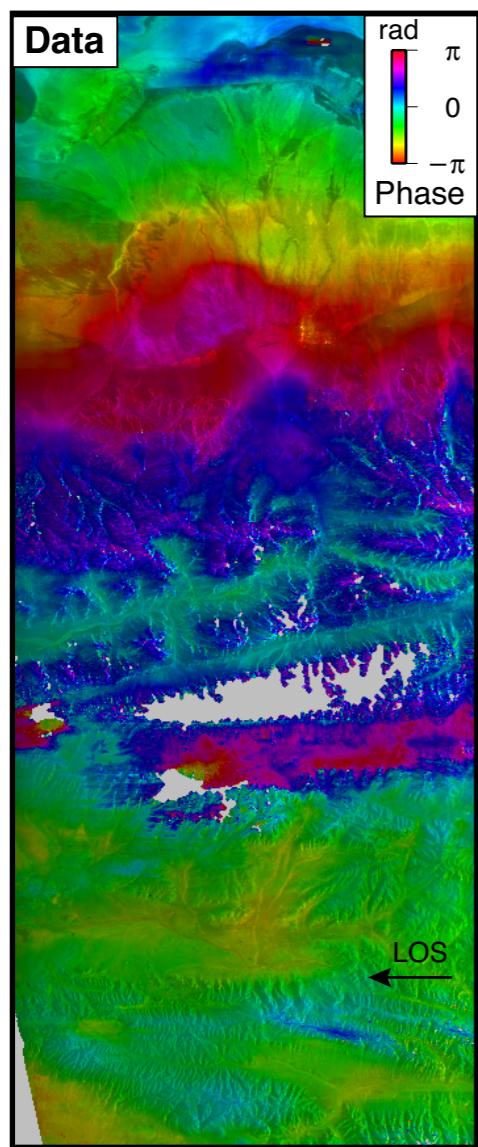
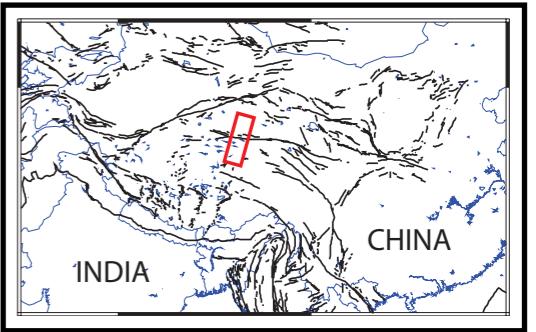
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- Deformation and Topography are related
- Lateral variations of the atmospheric stratification

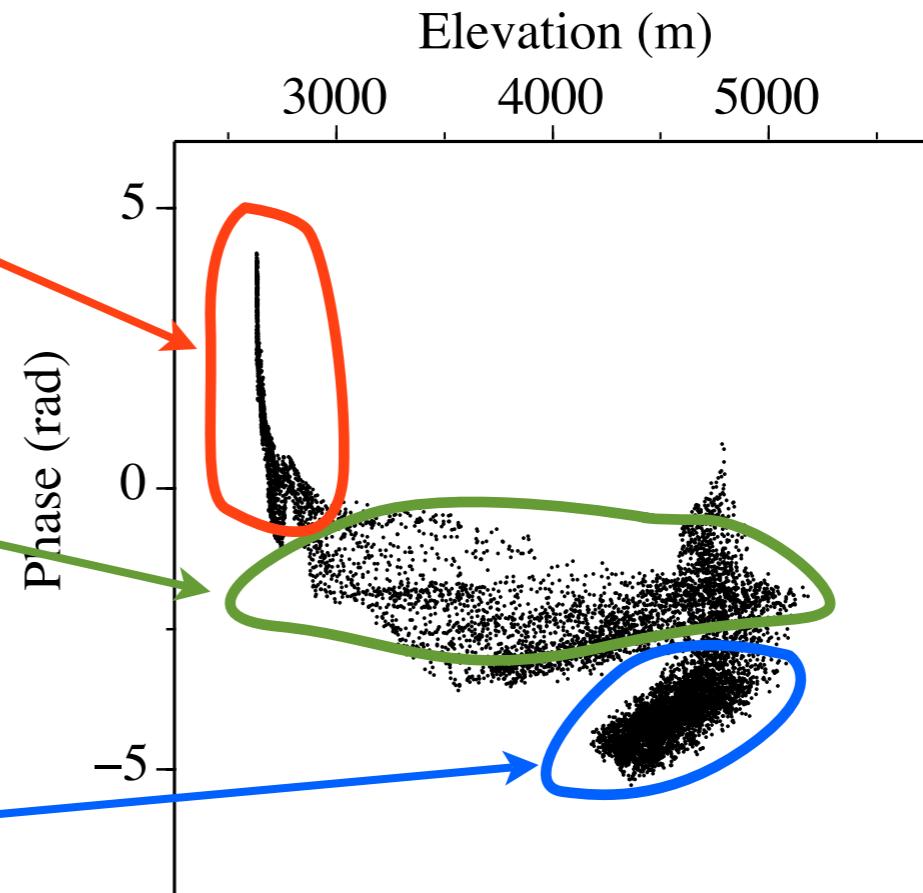
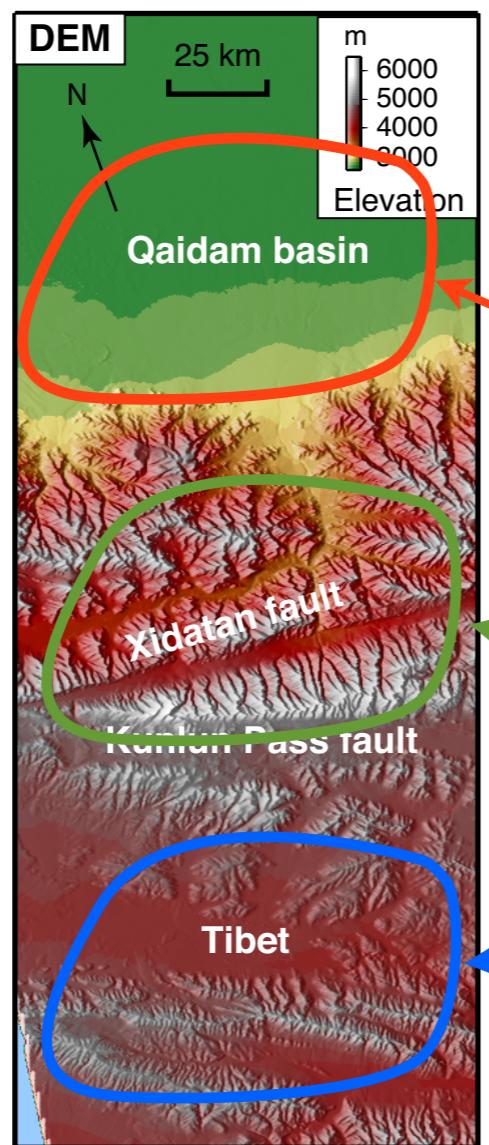
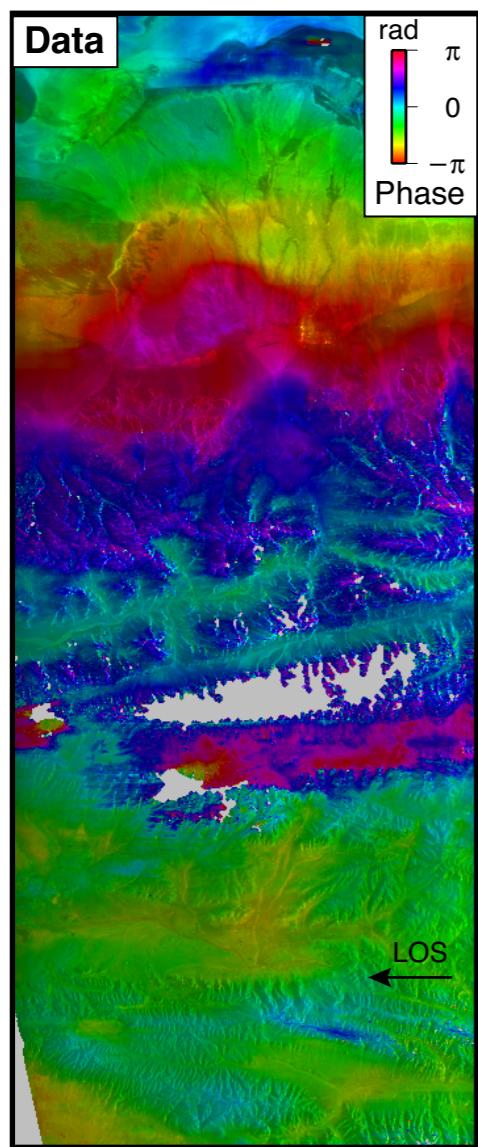
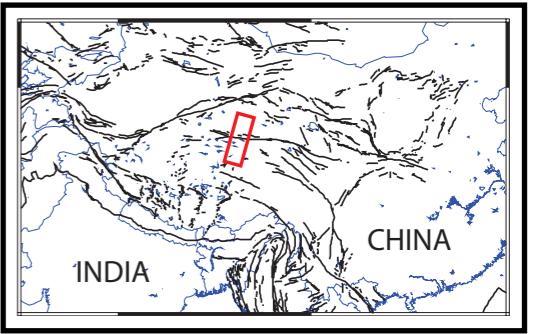
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# Global Atmospheric Models

## ERA-Interim

Dee et al, 2011

- ECMWF atmospheric model
- Global ~75 km grid
- 1989-...
- 4 solutions a day at 0 am, 6 am, 12 pm and 6 pm
- Altitude, temperature and water vapor partial pressure at 37 pressure levels (surface to 50 km alt.)

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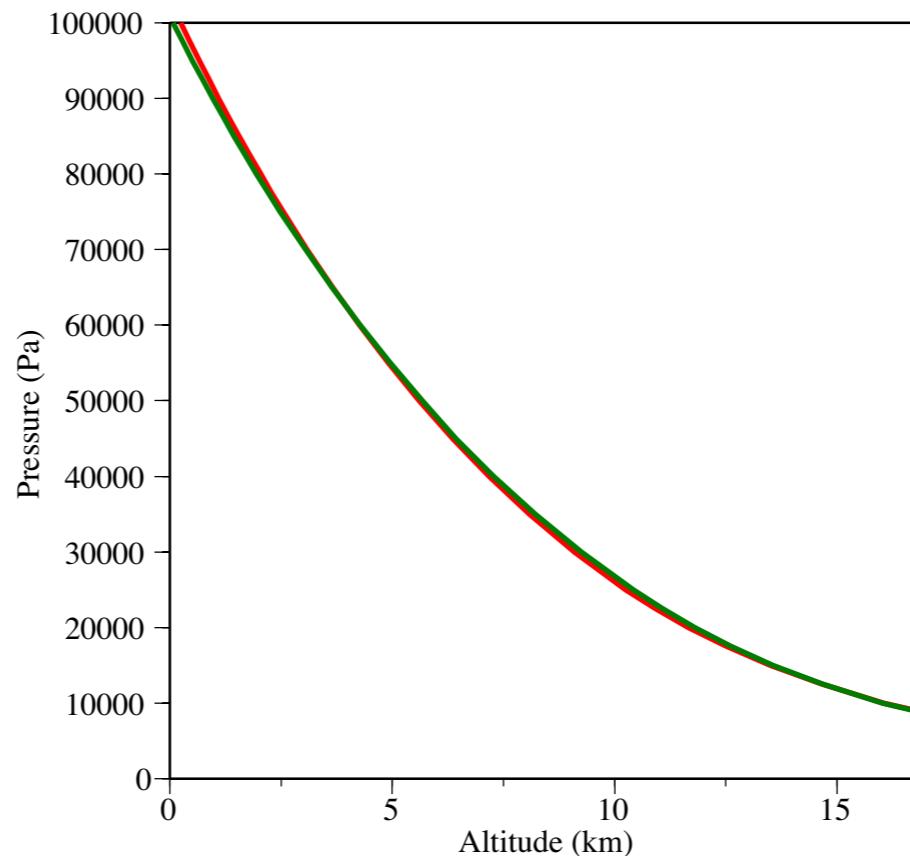
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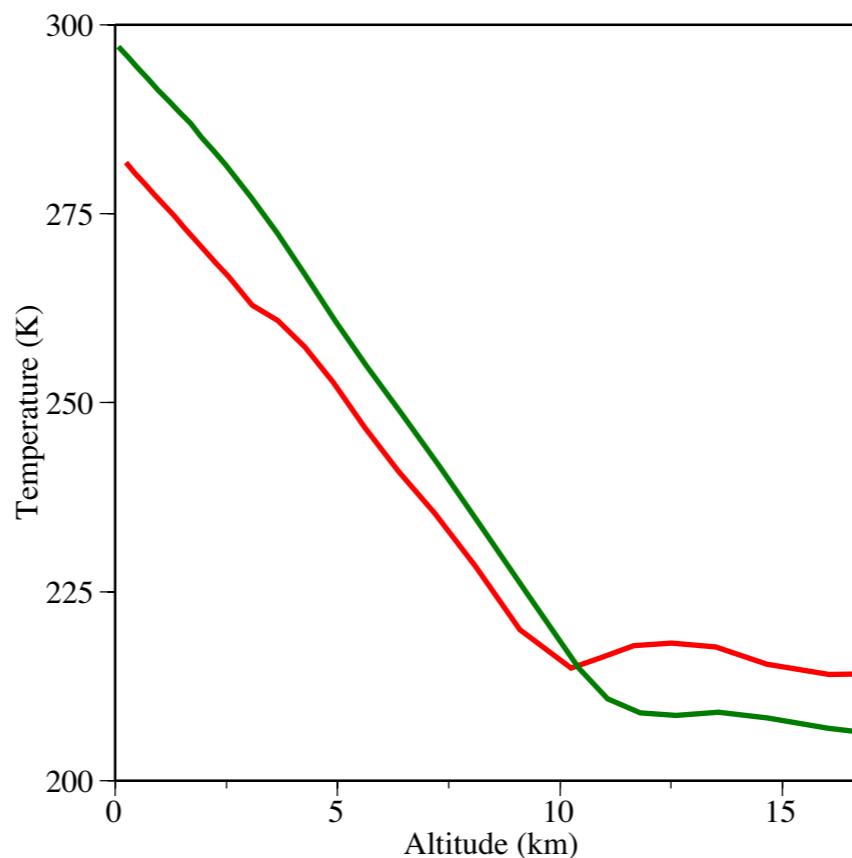


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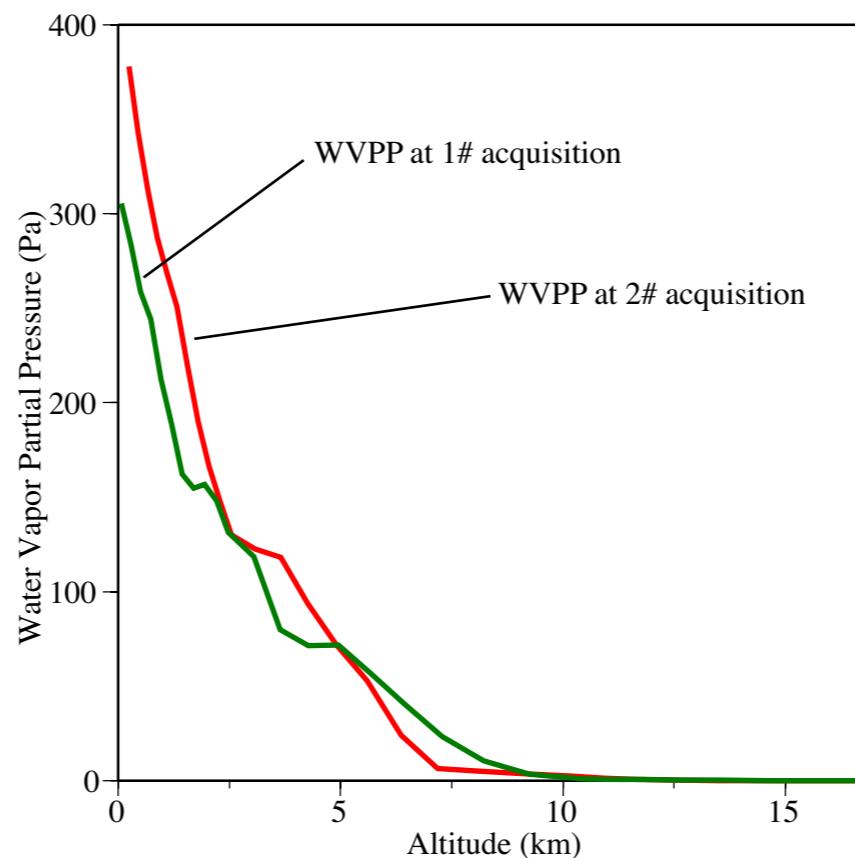


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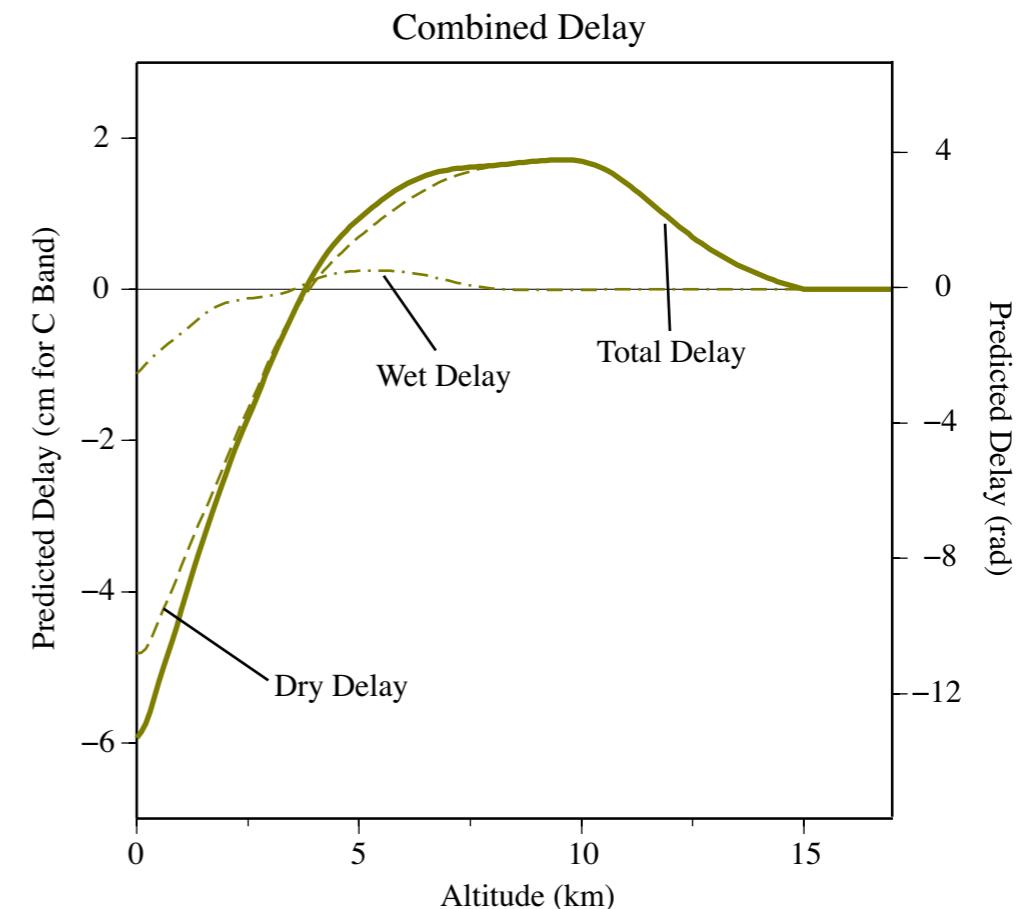
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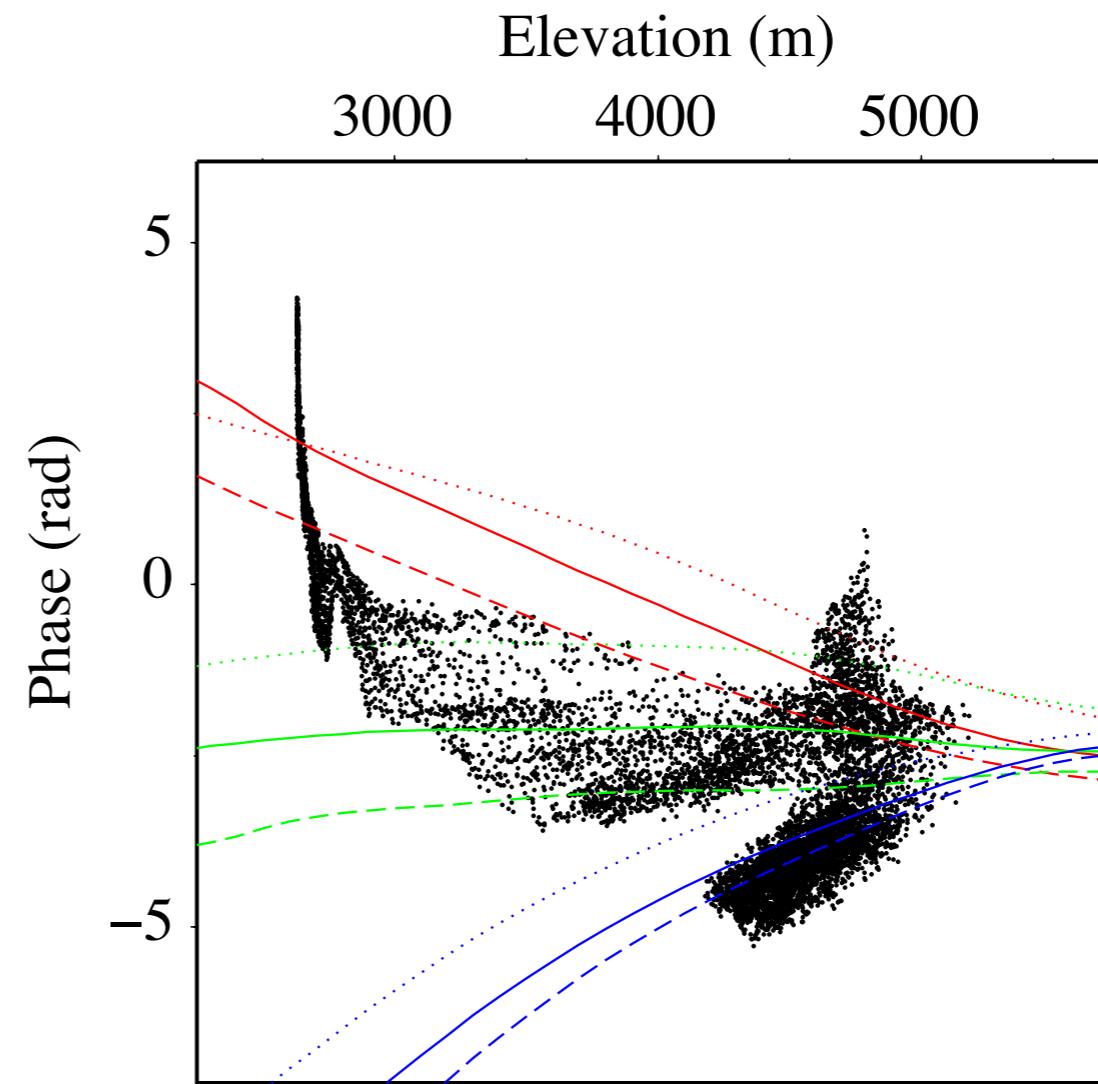
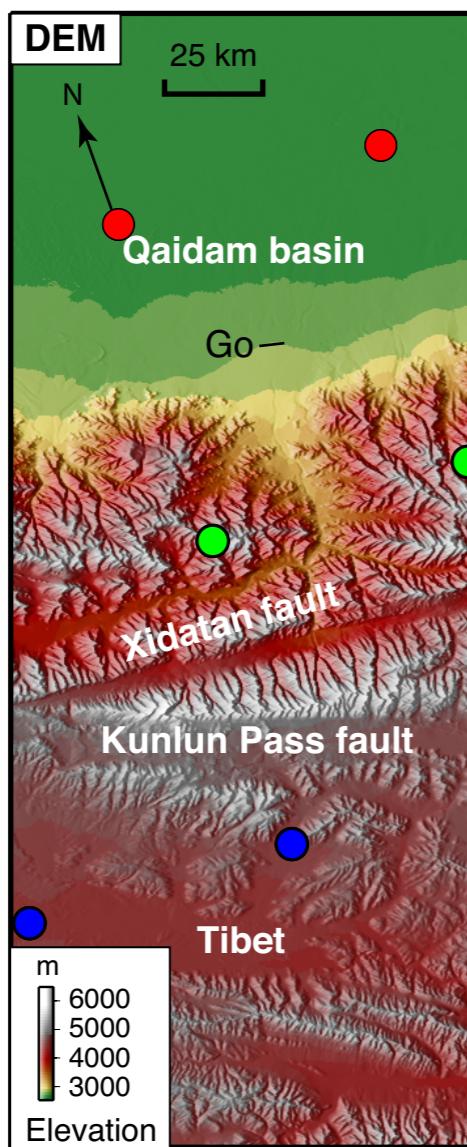
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$$\Delta L_{LOS}^s(z) = \delta L_{LOS}^{s2}(z) - \delta L_{LOS}^{s1}(z)$$



# Computing Delay Maps from GAM

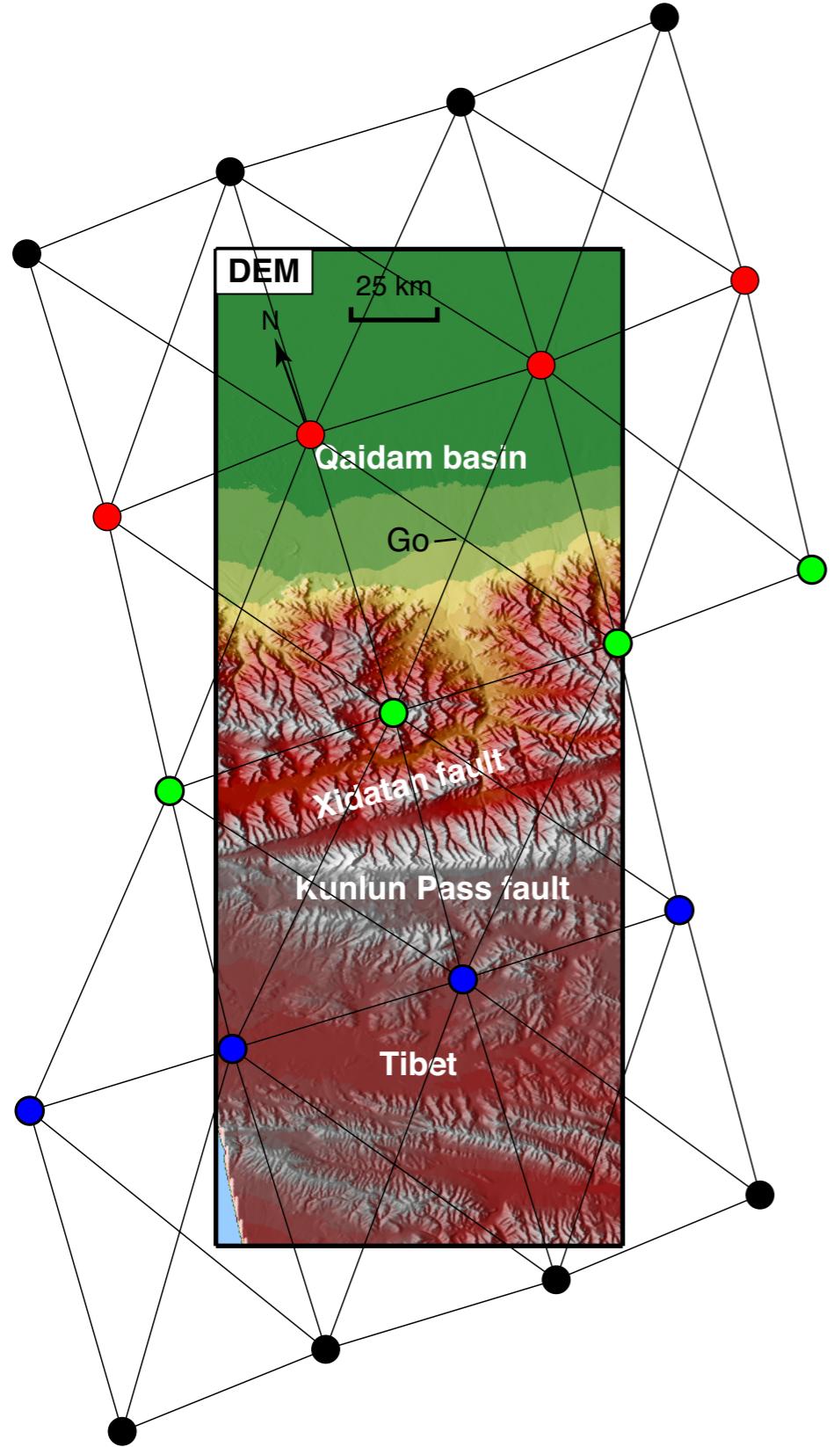
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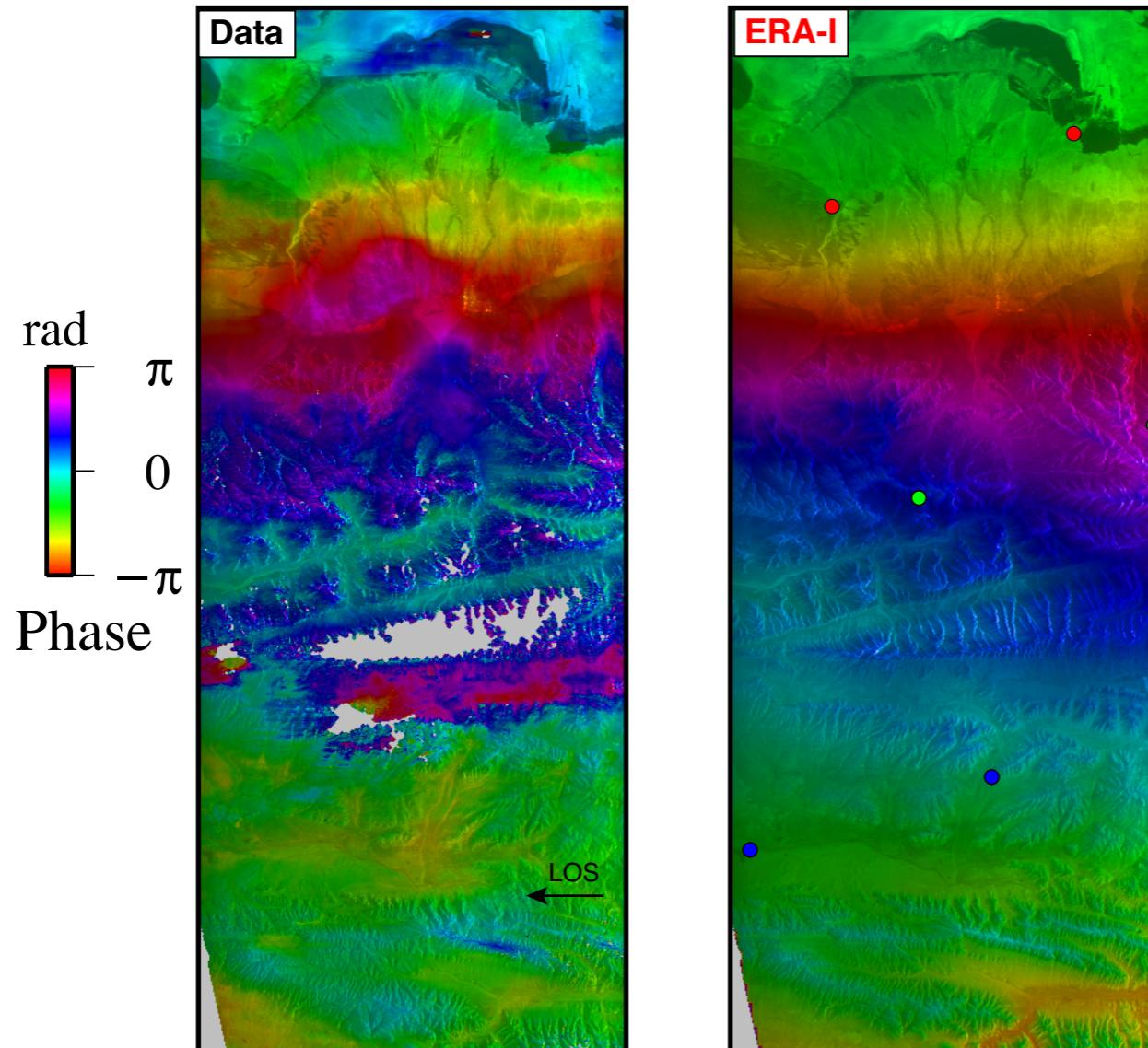
1 - Computing delay functions

2 - Spatial bilinear interpolation and  
spline interpolation for altitude

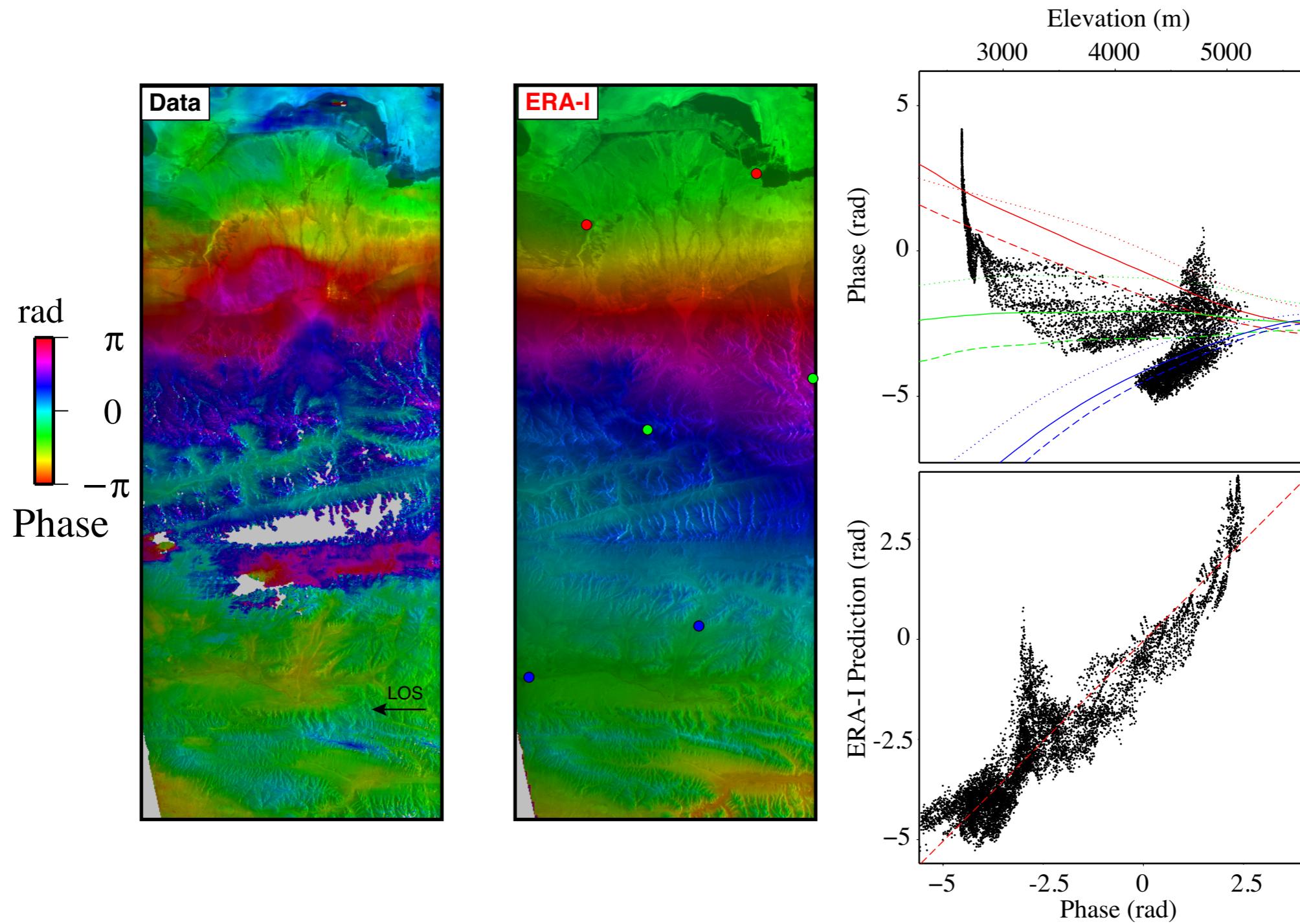


# Validation on unwrapped interferograms

One month temporal baseline == no deformation expected

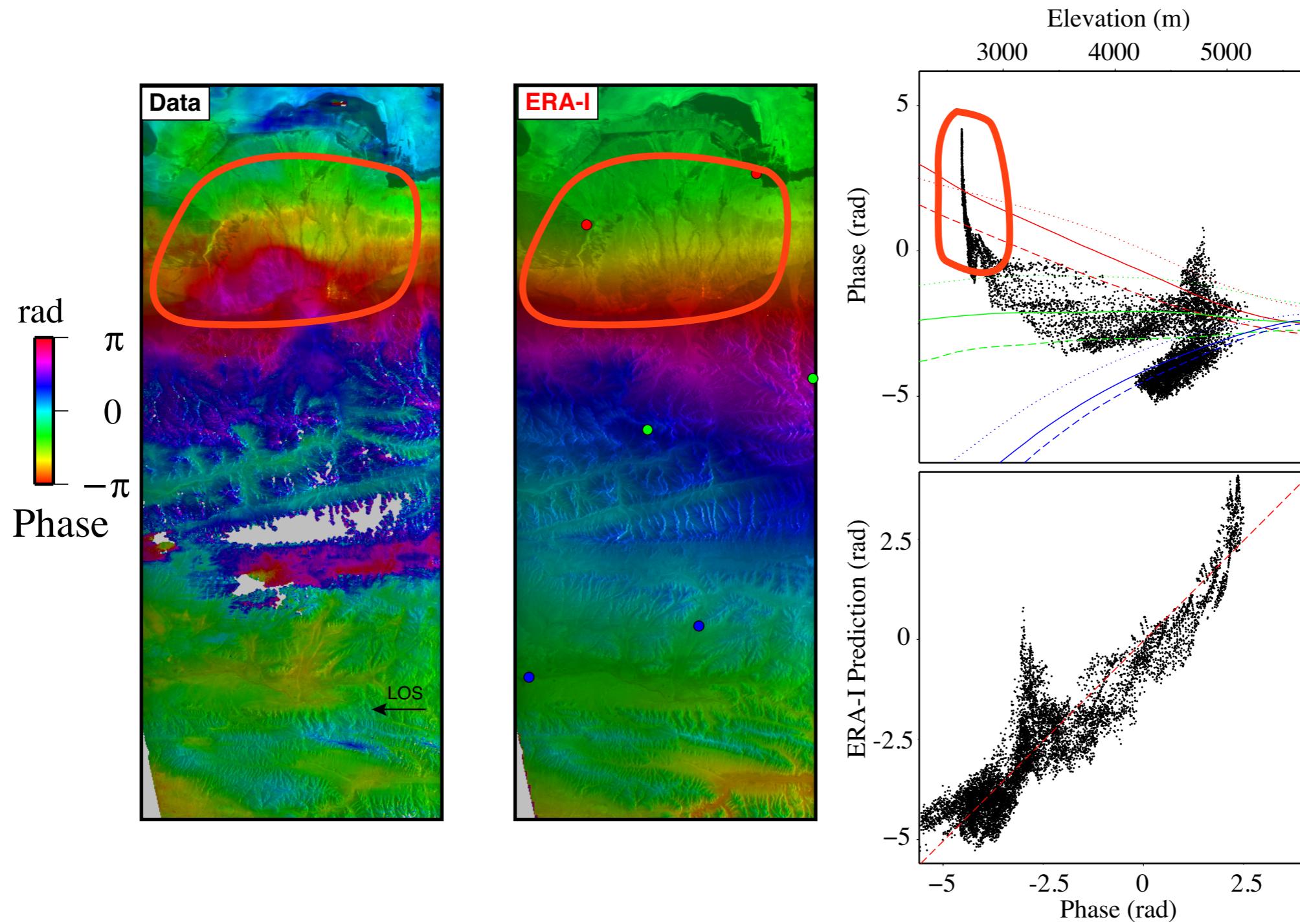


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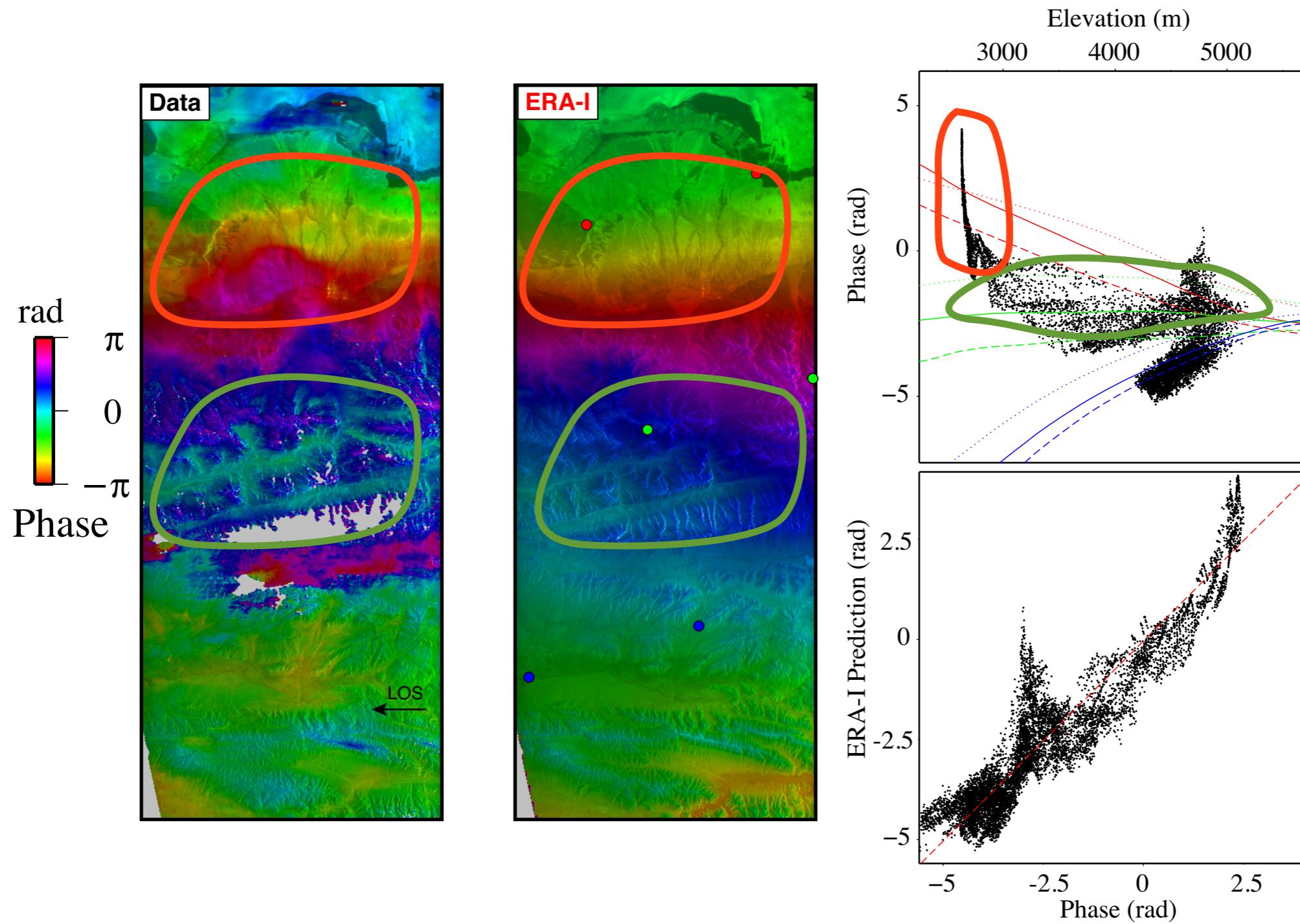
Data and prediction shows a good agreement  
Lateral variations are predicted

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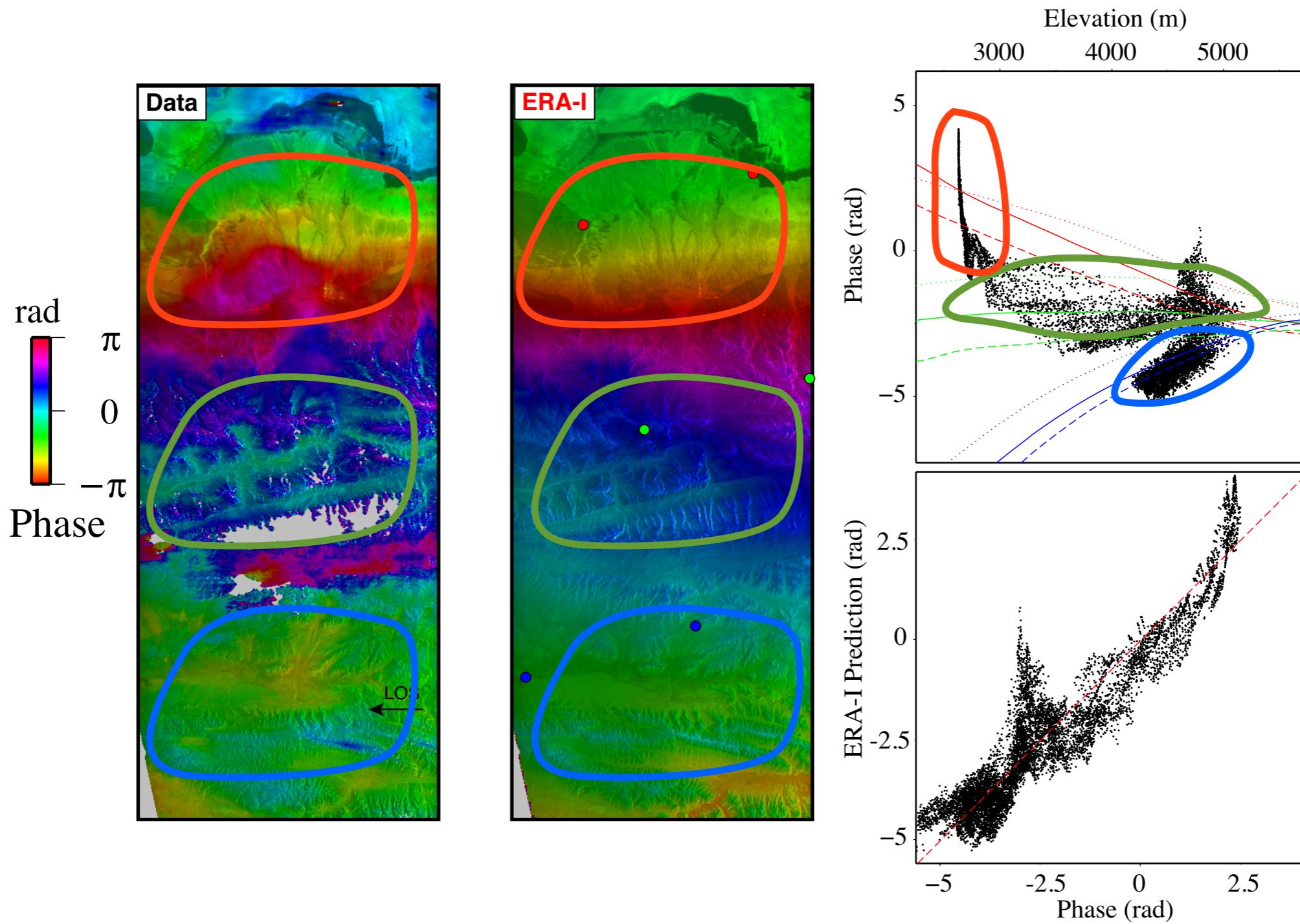
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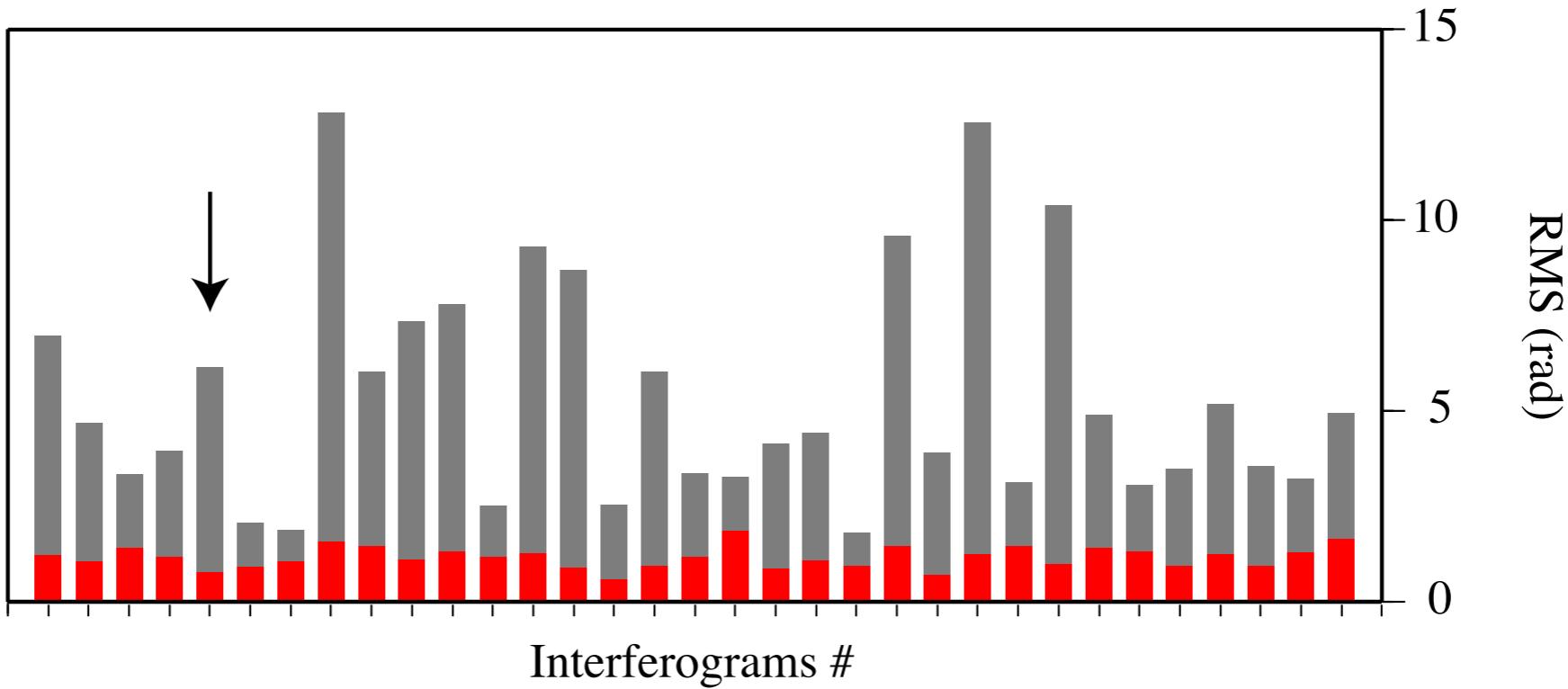
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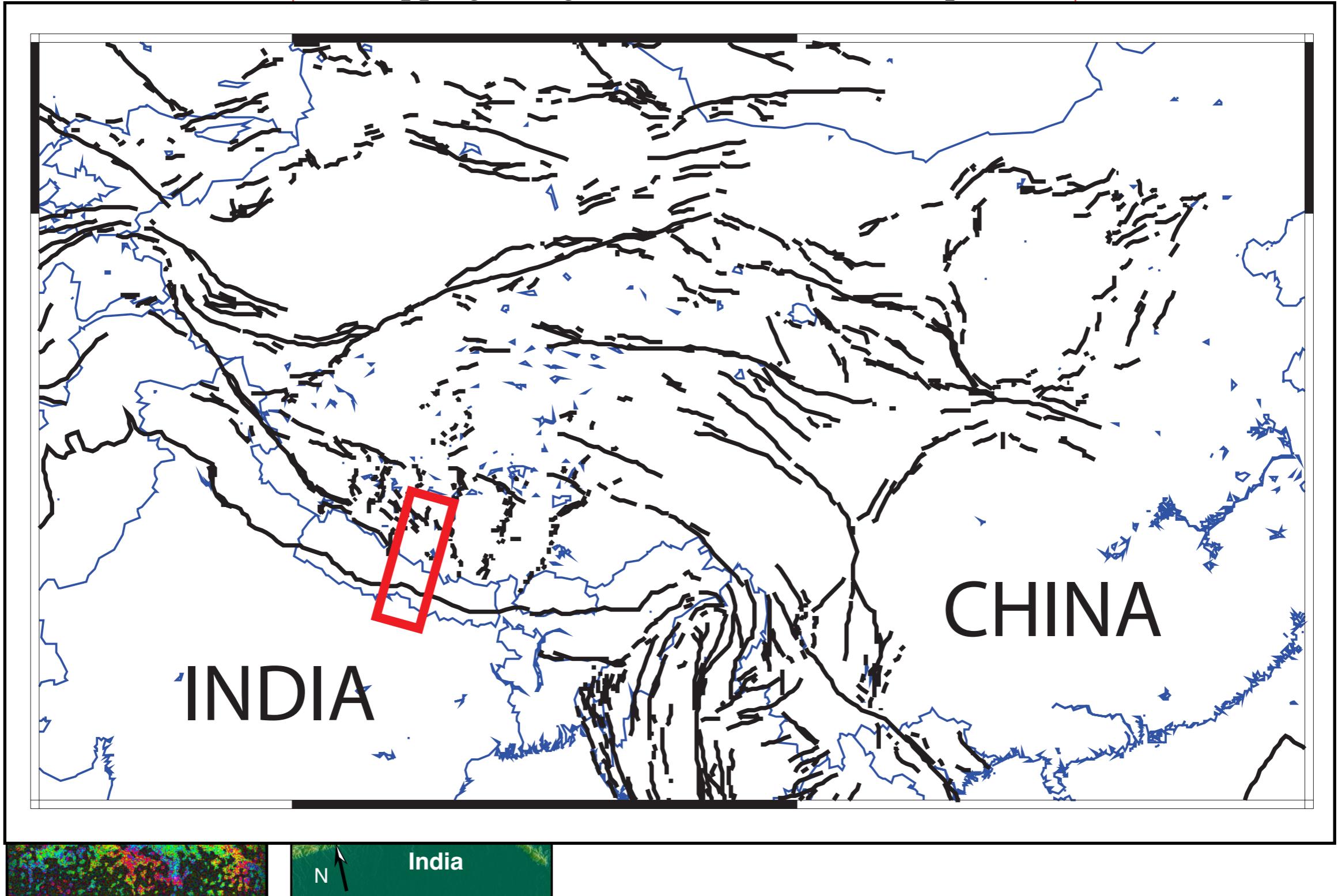


- 2D Full grid ERA-I correction: ~73% RMS reduction
- 1D ERA-I correction: ~71% RMS reduction
- Empirical correction (Cavalie et al 2008) : ~71% RMS reduction

-- At least as efficient as the empirical method  
-- Unbiased method, no parameter estimation

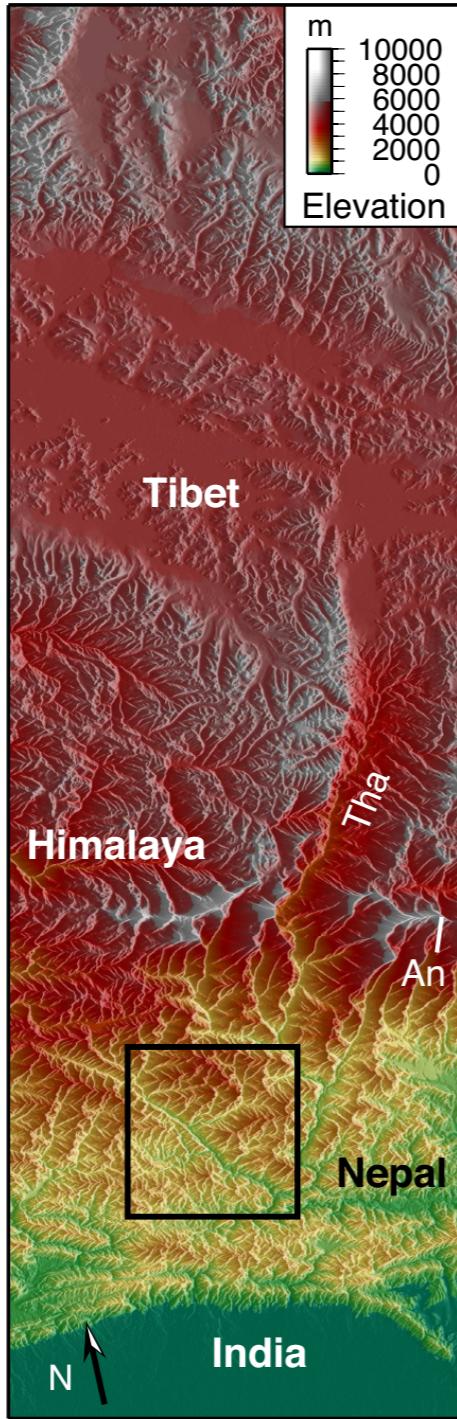
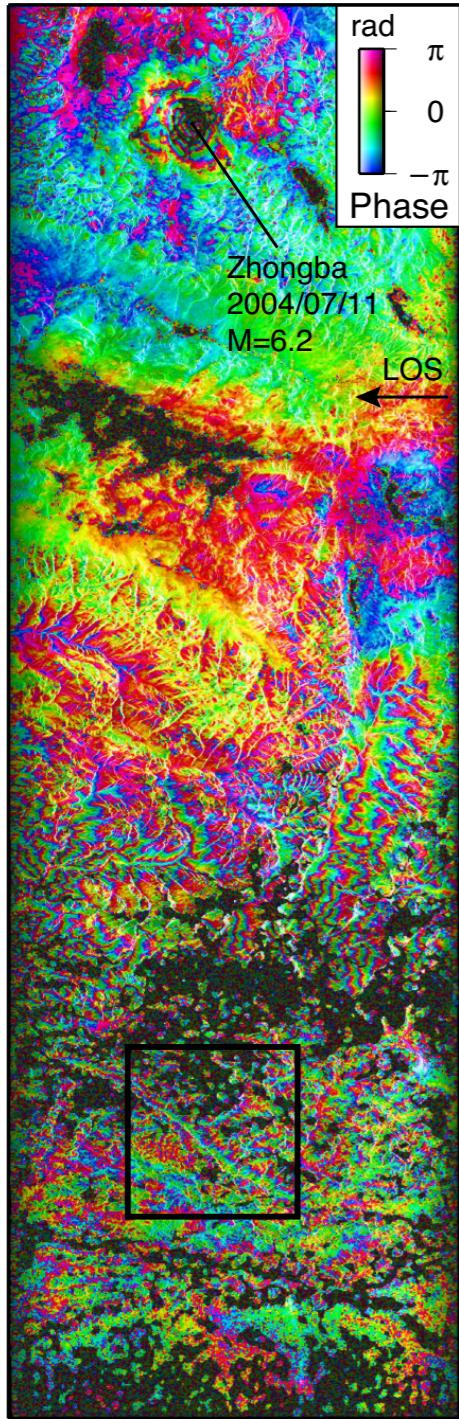
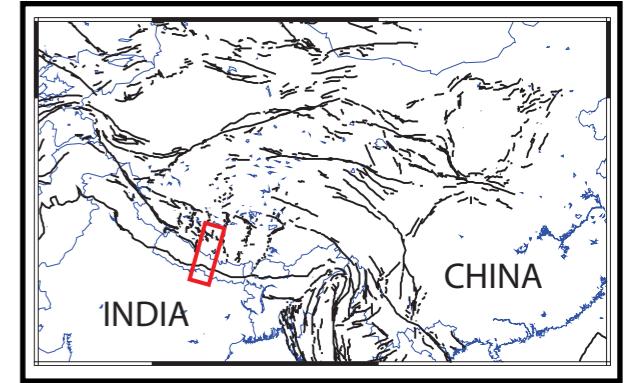
# Enhancing the Unwrapping

Unwrapping in high relief area is almost impossible



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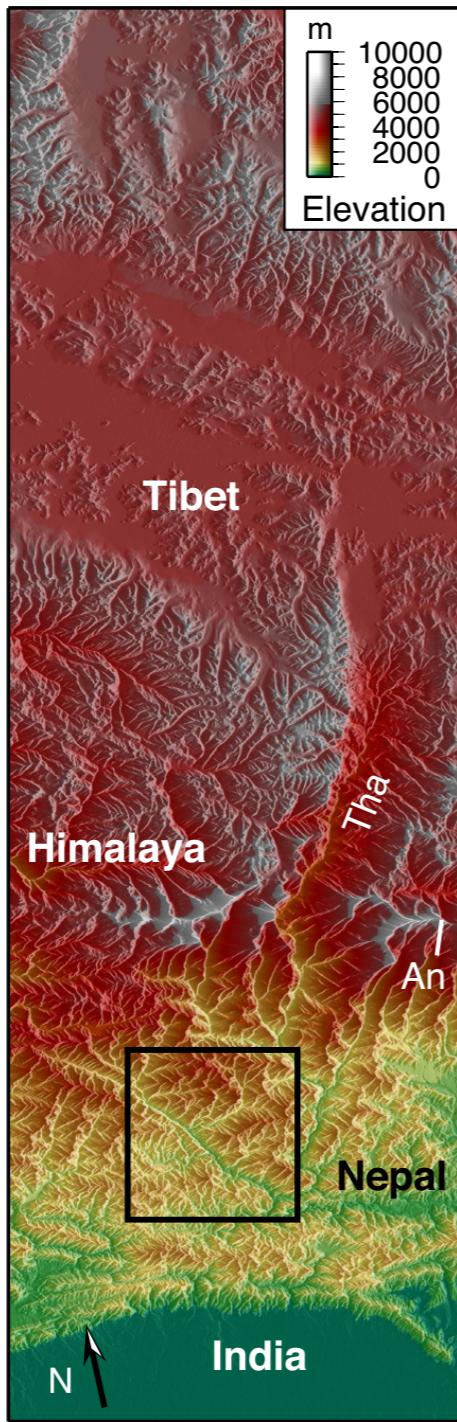
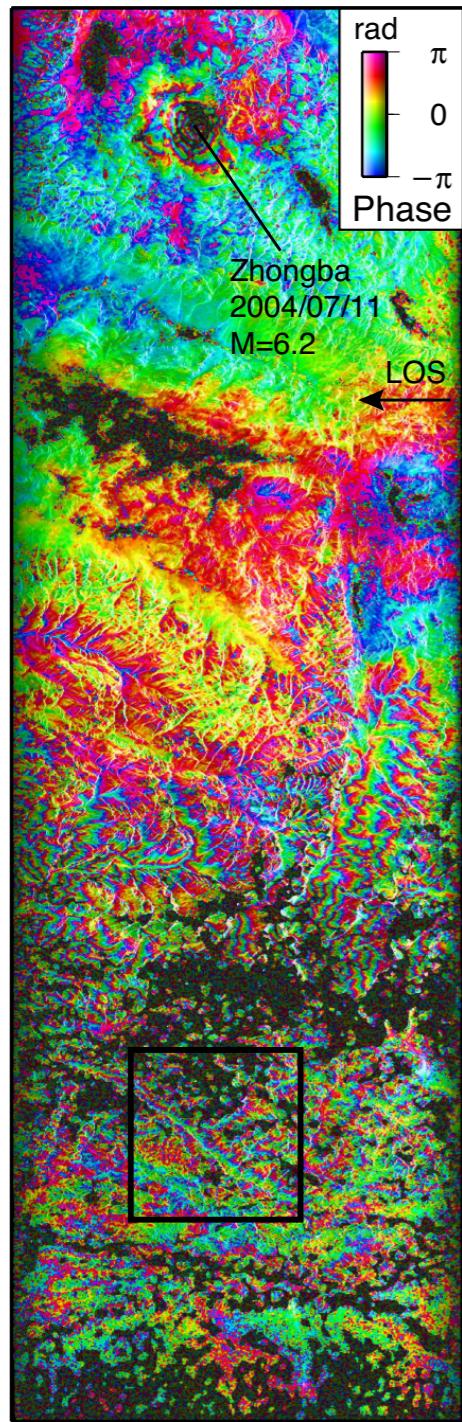
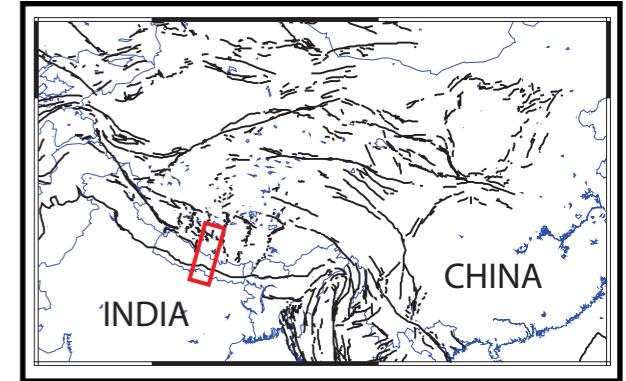
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- In high relief areas, the coherence is poor.
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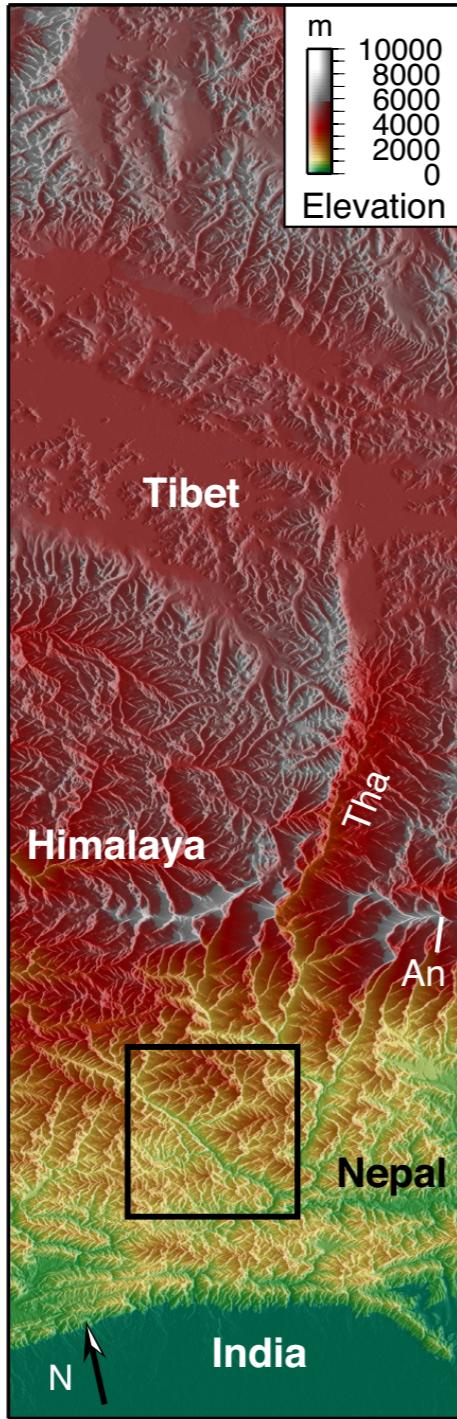
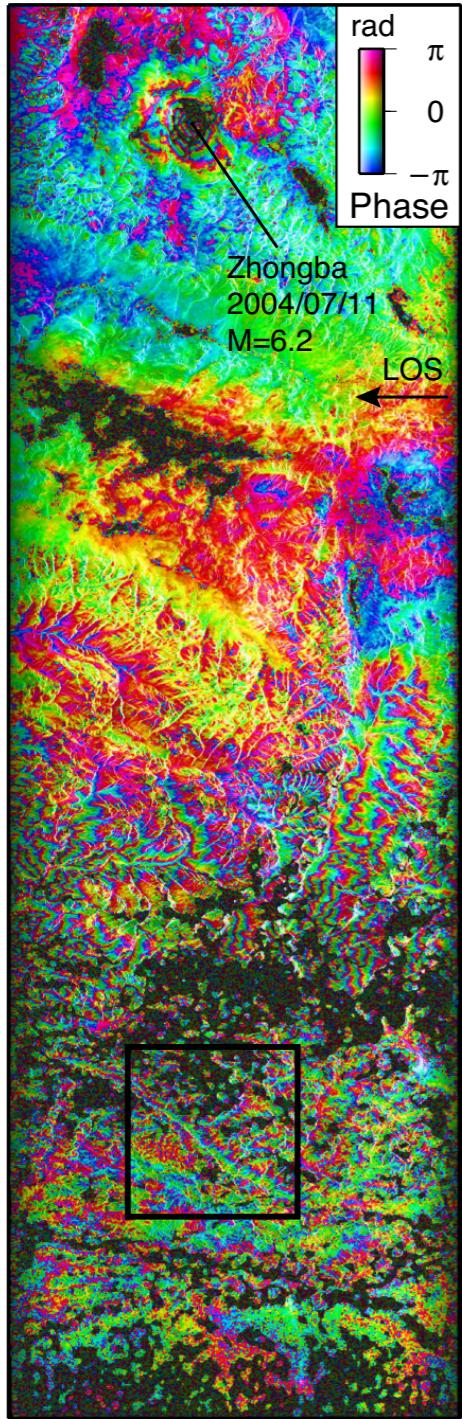
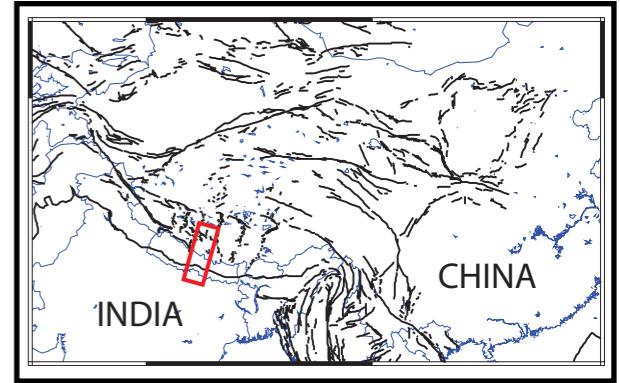
But...

- Downlooking aliases fringes

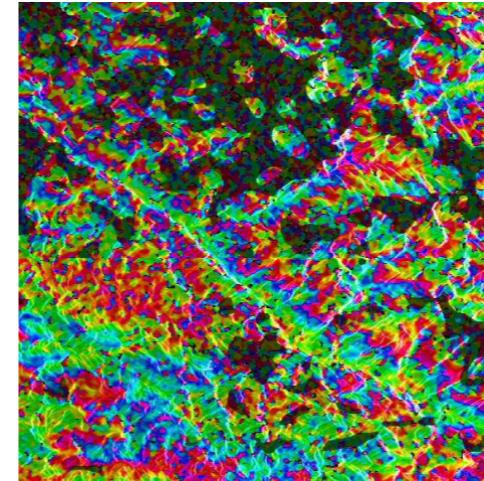
→ Unwrapping Errors

# Enhancing the Unwrapping

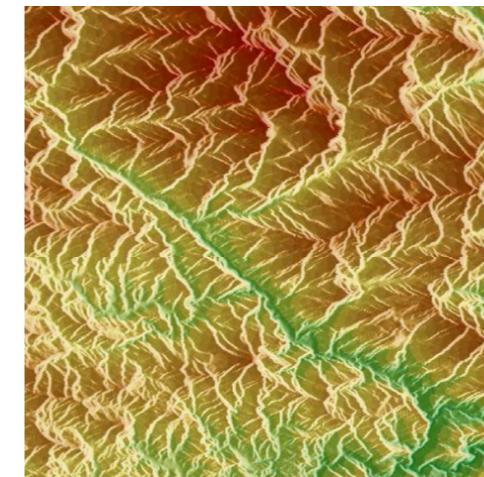
Unwrapping in high relief area is almost impossible  
Atmospheric correction reduces the fringe rate



Data

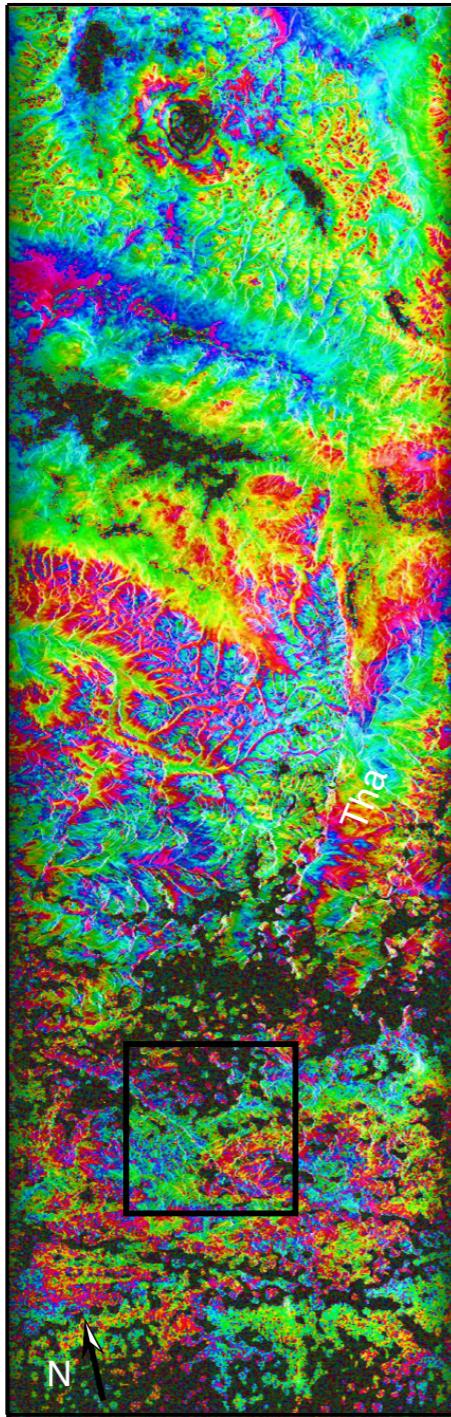
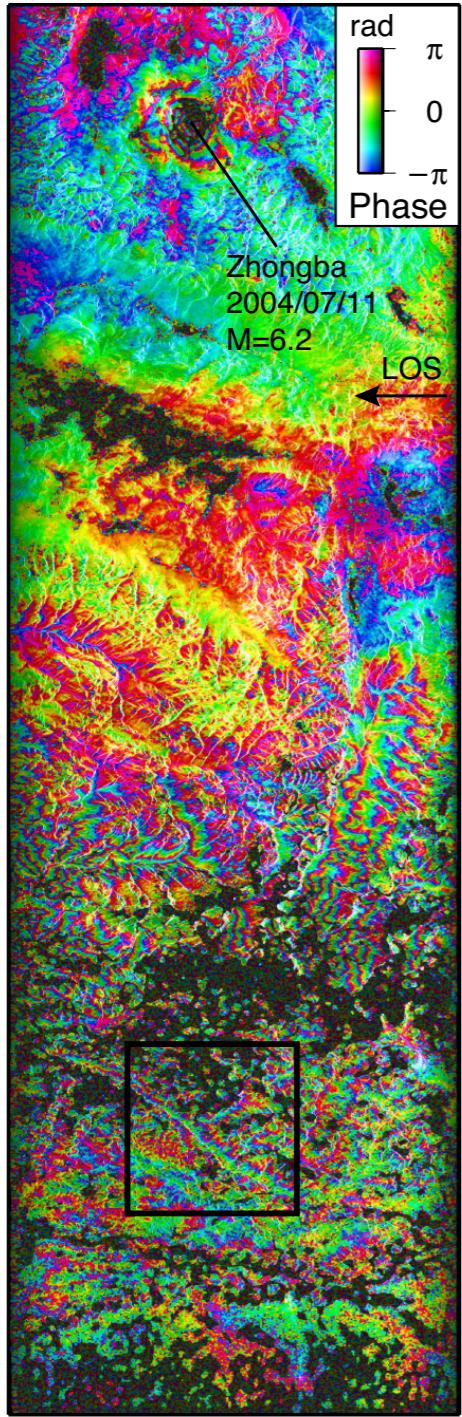
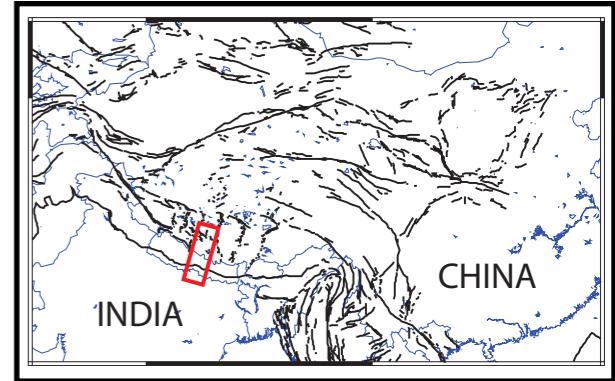


DEM

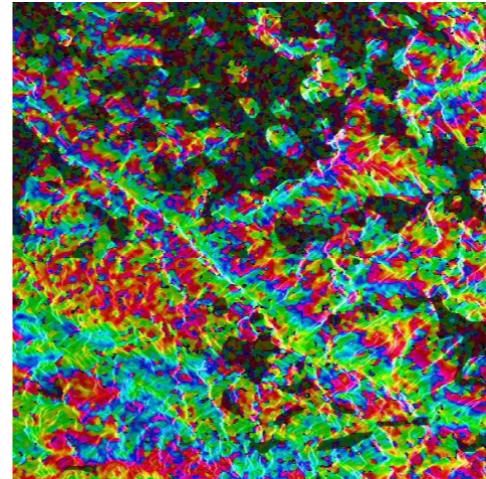


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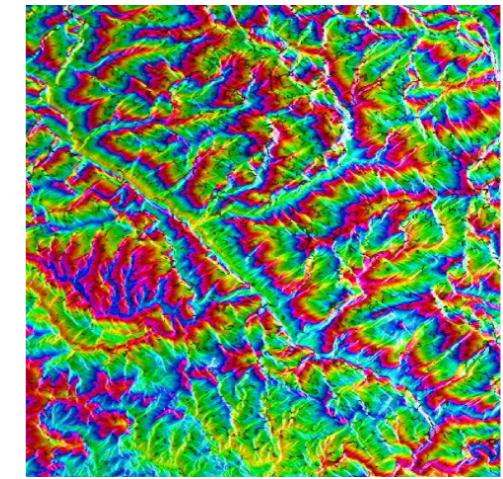
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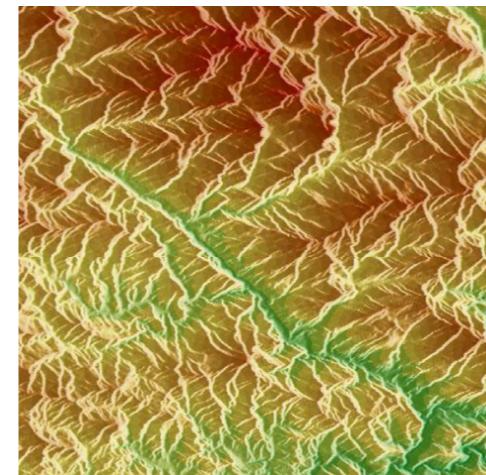
Data  
Wrapped



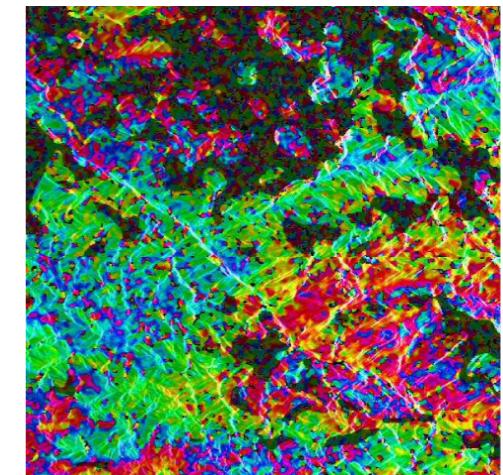
ERA-I Prediction  
Wrapped



DEM

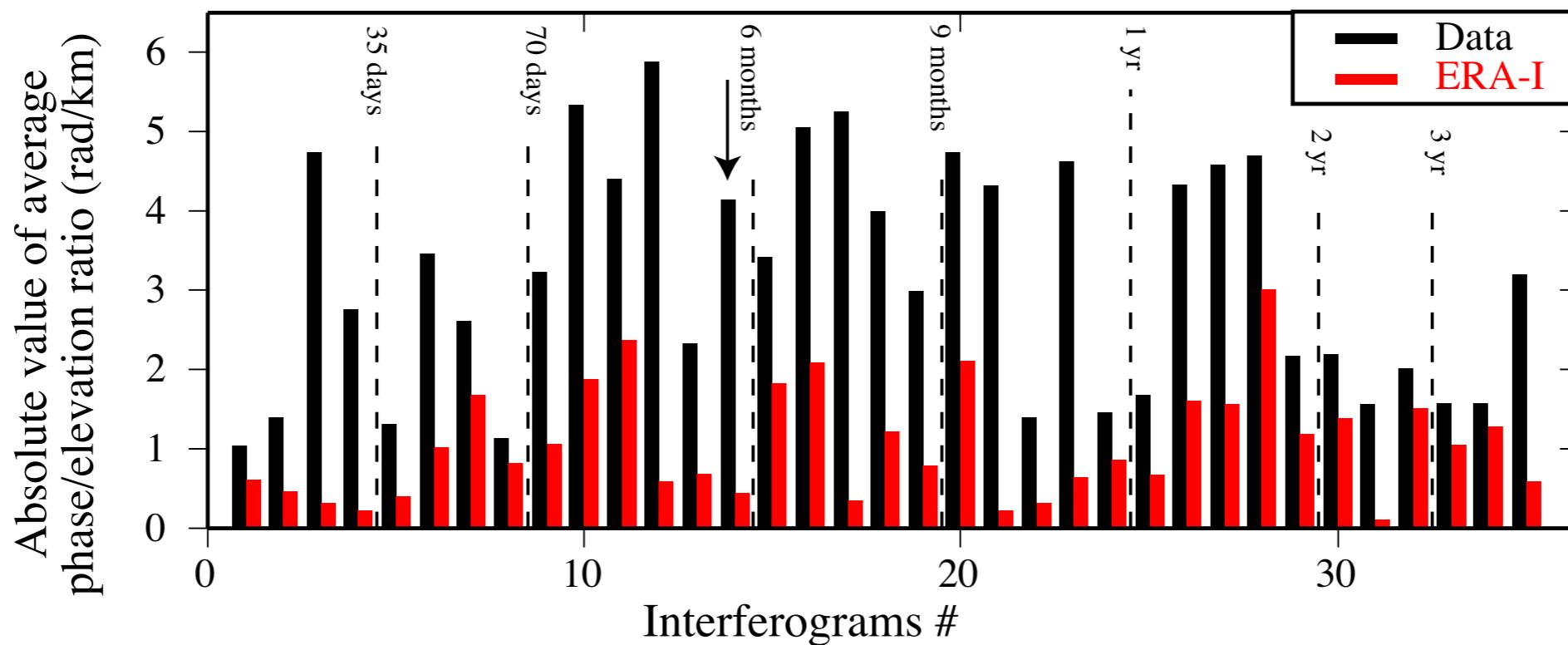


Residuals  
Wrapped



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Unwrapping in high relief area is almost impossible  
Atmospheric correction reduces the fringe rate



- Fringe rate reduction avoids fringe aliasing during downlooking
- Phase ambiguity is under control, so are unwrapping errors

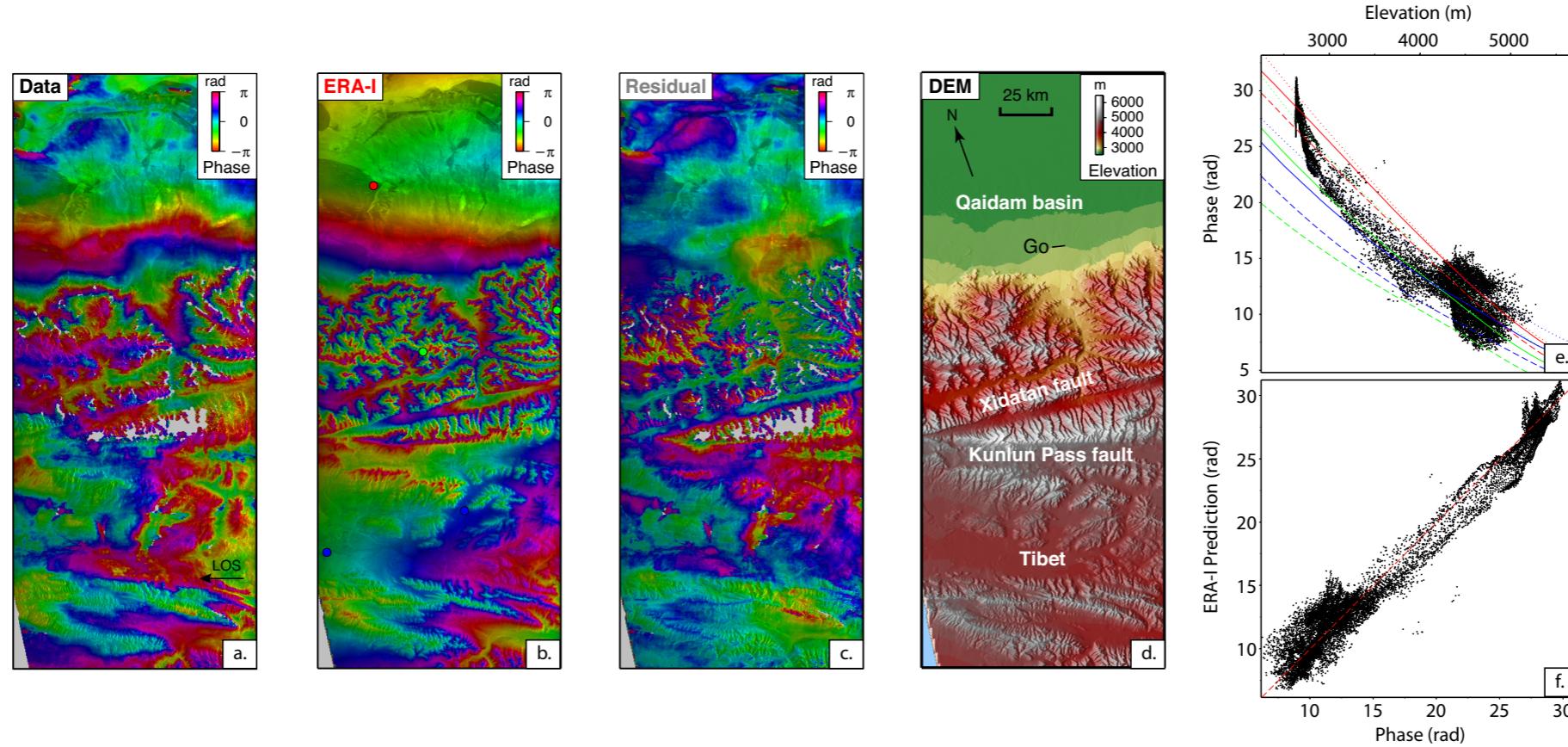
# Conclusions

- We validate the use of GAM to produce stratified delay maps and correct interferograms

→ Unbiased corrections for unbiased time series analysis  
Help the unwrapping process

- This method is simple, its computational cost is low, it is global  
We rely on GAM improvements for more precise corrections

→ It should be included in the future interferometric chains

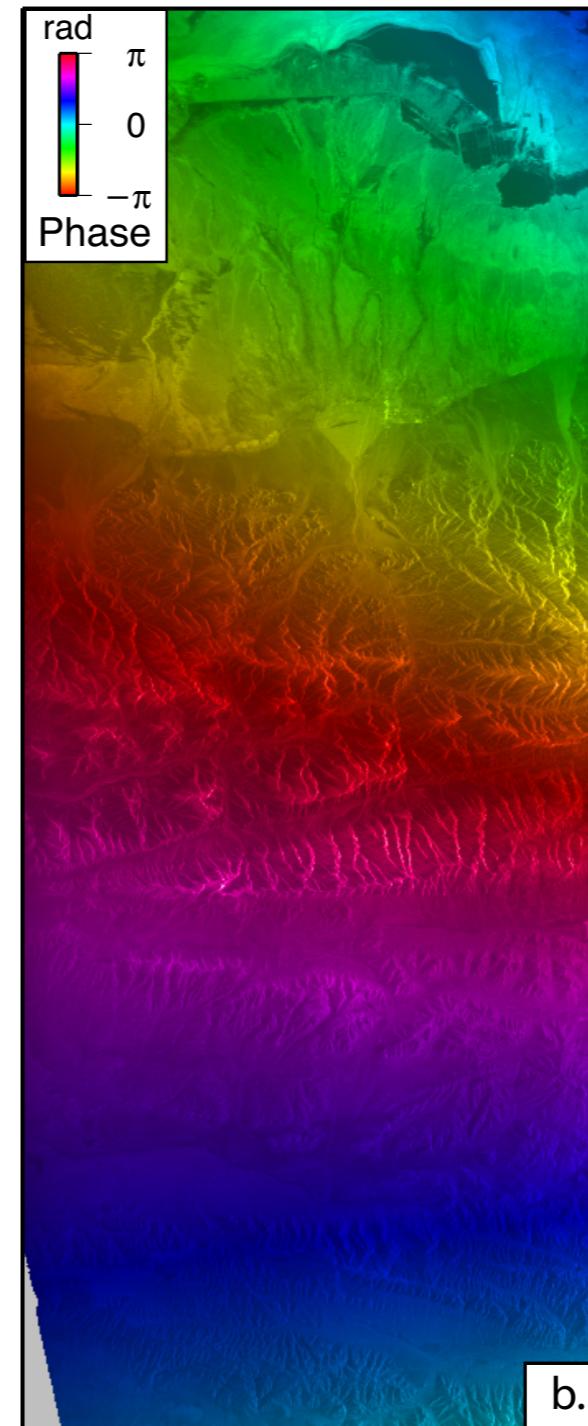


# Orbit estimation

Empirical Estimation

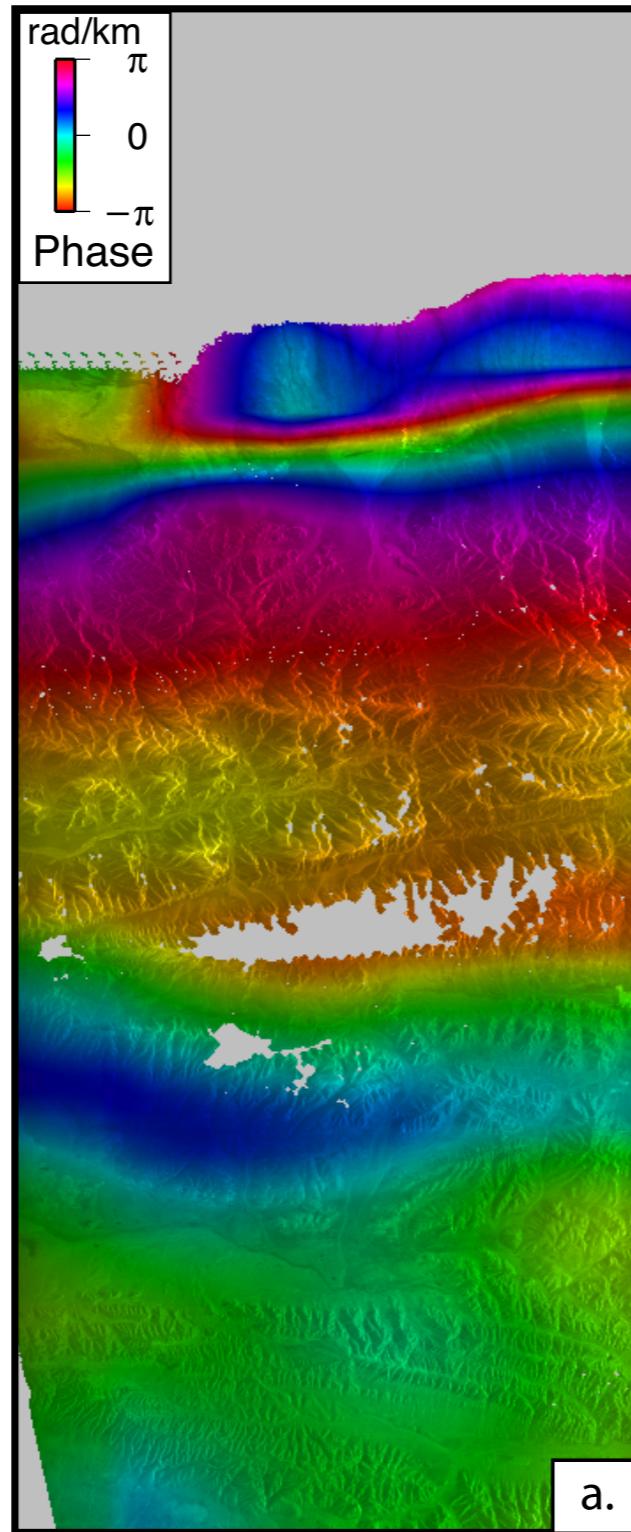


2D full grid ERA-I

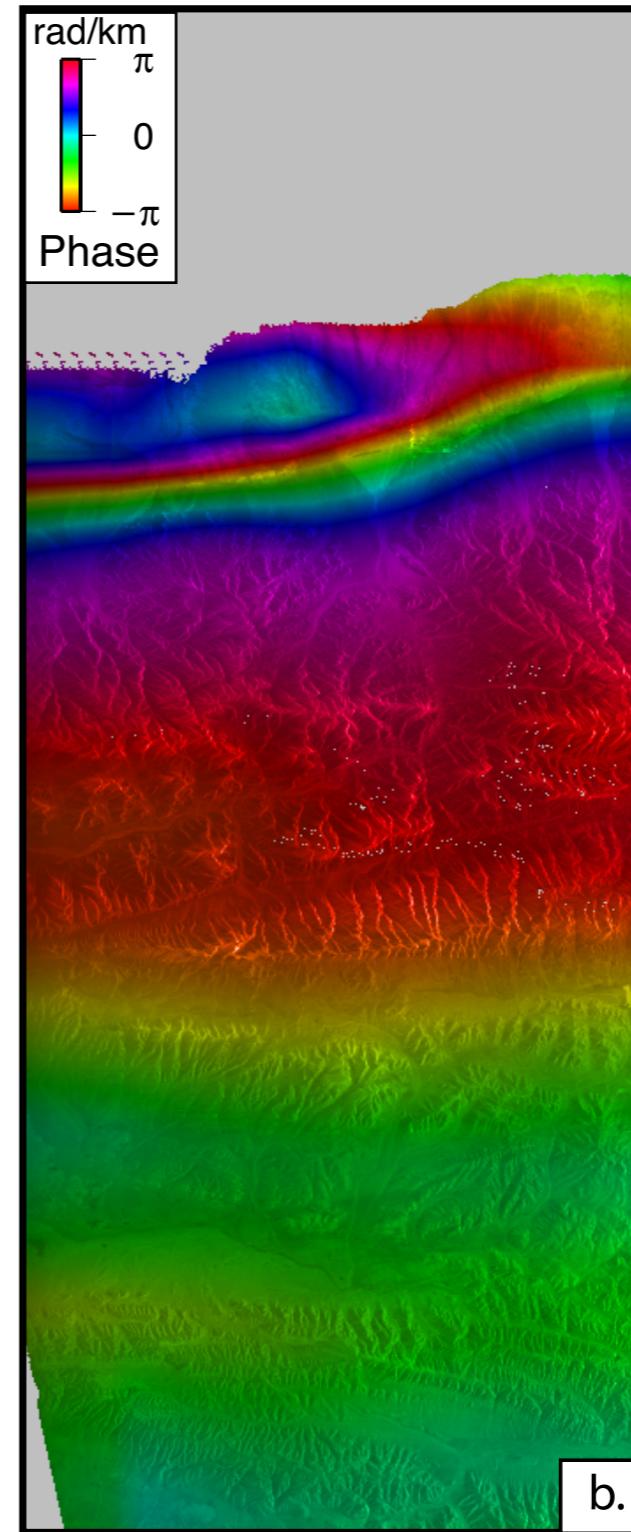


# Local Phase/Topography Relationship

Unwrapped Data



2D full grid ERA-I



a.

b.

