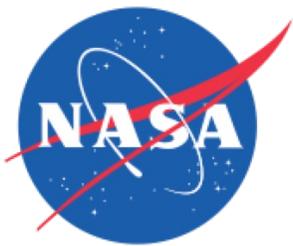


# Closure phase bias: signal or noise?

Yujie Zheng(1), Heresh Fattahi(2), Piyush Agram(1), Mark Simons(1,2), Paul Rosen(2)

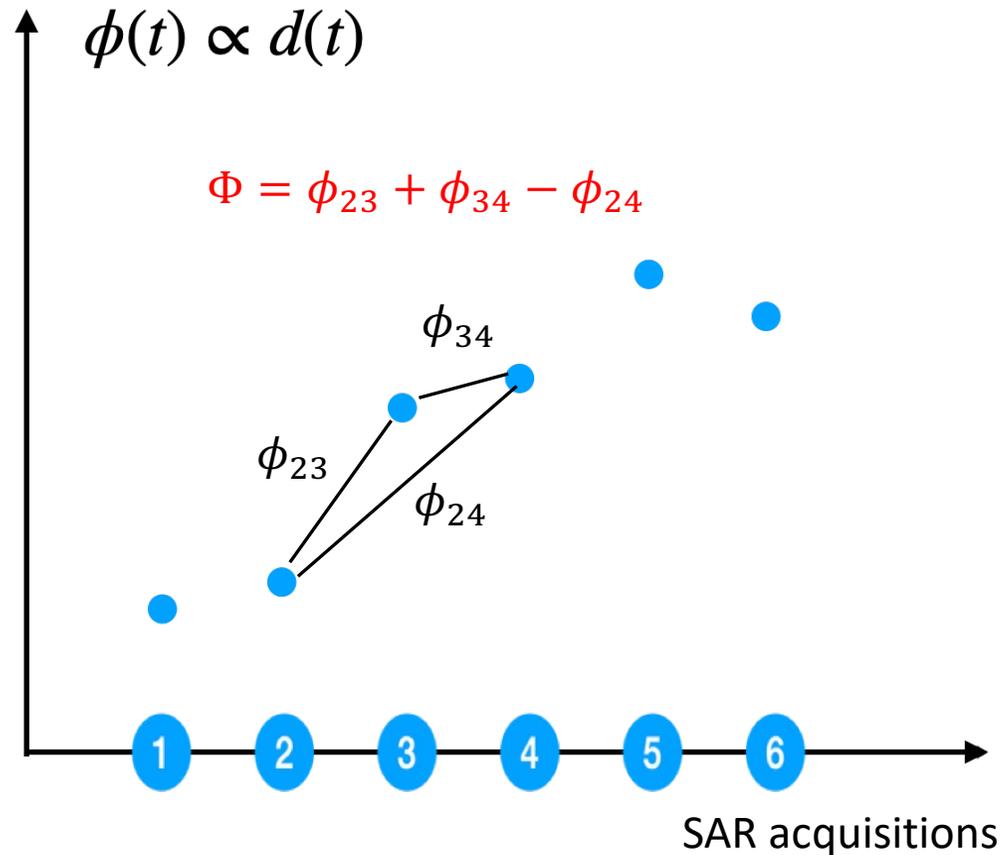
(1) California Institute of Technology, USA (2) Jet Propulsion Laboratory, California Institute of Technology, USA

## 2022 NiSAR Science Community Workshop

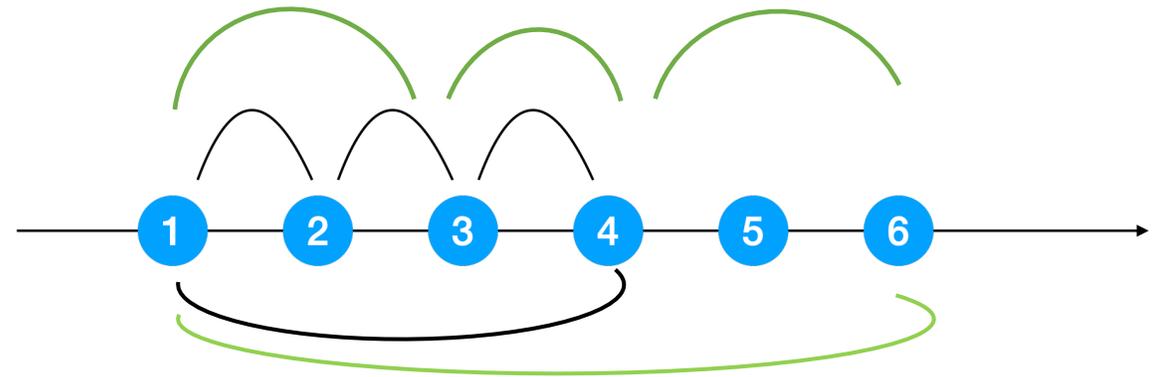


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# Closure phase measures the phase consistency among InSAR phase measurements



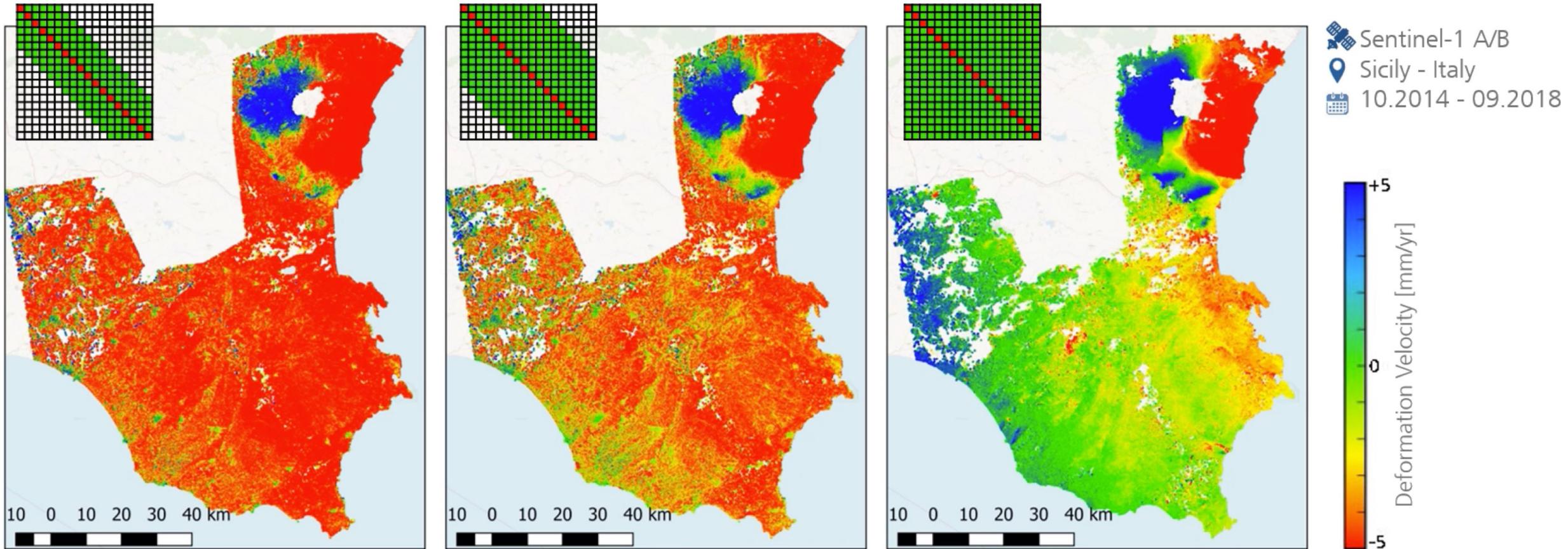
Closure phase can be defined on any closed loop.



Zero closure phase is always true for **single-look** measurements

Zero closure phase is generally NOT true for **multi-looked (spatially averaged)** measurements

# Same Time-series — Different Deformation



Increasing maximum temporal baseline

← Increasing velocity bias

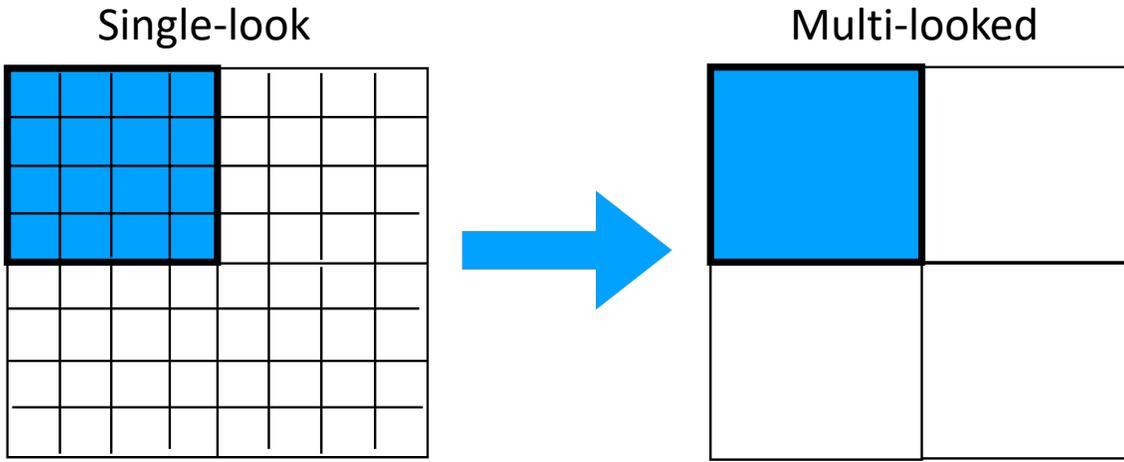
Ansari et.al. (2020): Study of Systematic Bias in Measuring Surface Deformation

Closure phase bias: signal or noise?

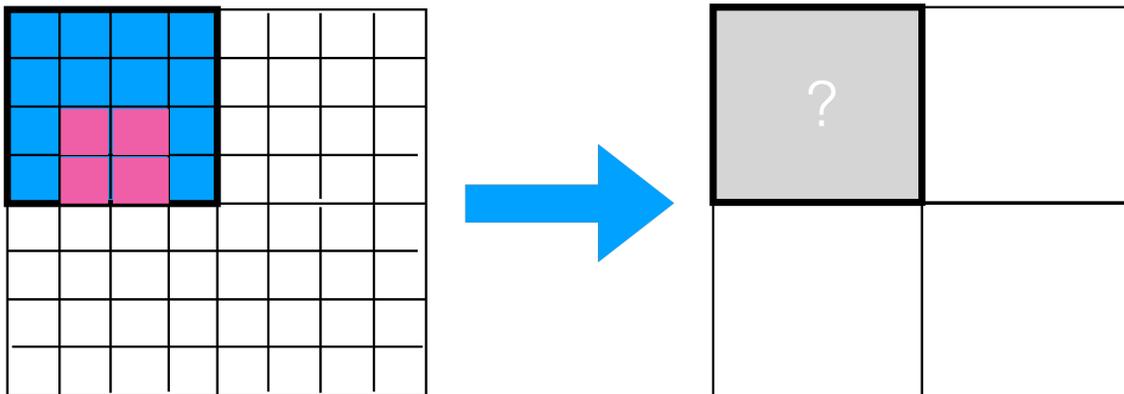
It is noise in the context of deformation modeling.

How to correct?

# Multi-look : averaging single-look measurements

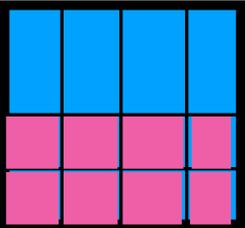


The Earth's surface is naturally heterogeneous.



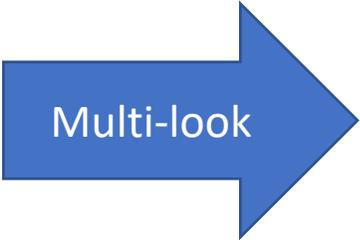
Single-look		Multi-look
Amp	Phase	Phase
$a$	$\Delta\phi$	$\Delta\phi^m = \Delta\phi$
Amp	Phase	Phase
$a^I$	$\Delta\phi^I$	$\Delta\phi^m = \sum_i w_i \Delta\phi_i$
$a^{II}$	$\Delta\phi^{II}$	
		$w = f(a^I, a^{II})$

Closure phase bias signals the presence of temporally inconsistent processes (processes that change both the phase and the amplitude of the interferometric measurement)



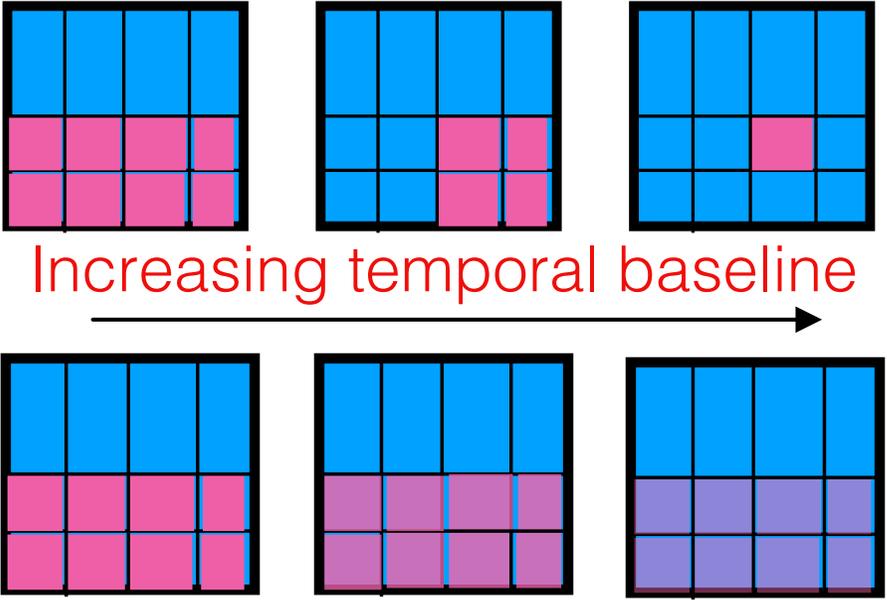
$$\Delta\phi^I = \Delta\phi^{def}$$

$$\Delta\phi^{II} = \Delta\phi^{def} + \Delta\phi^x$$



$$\Delta\phi^m = \Delta\phi^{def} + \boxed{w\Delta\phi^x} \quad \text{bias}$$

$w = w(\Delta t)$



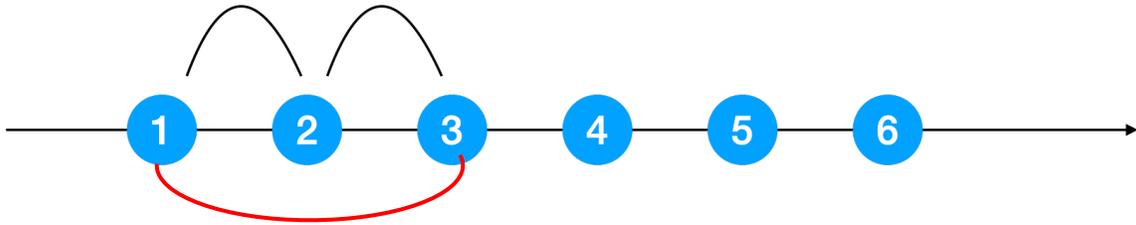
Example:  
Soil moisture variation

$$\text{Air, } k = \frac{2\pi}{\lambda}$$

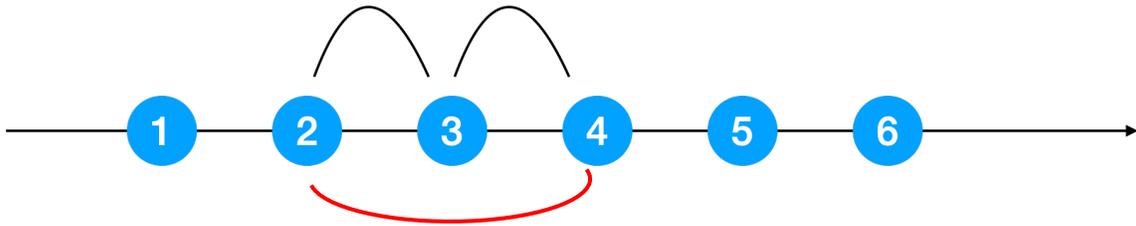


Soil,  $k'$  is complex

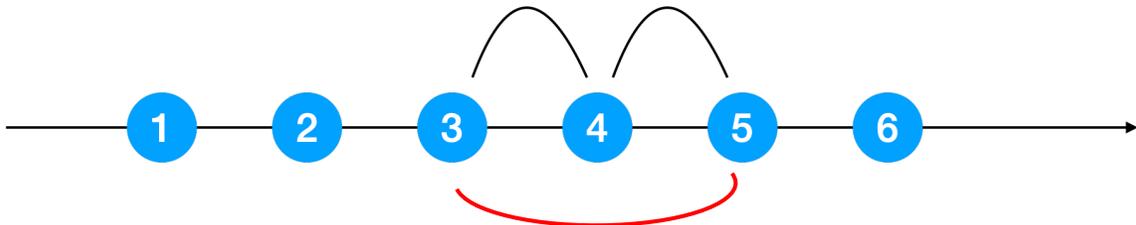
We can use sequential closure phase to reconstruct the phase history of the temporally inconsistent process



$$\Phi_{123} \propto \Delta\phi_{13}^x$$



$$\Phi_{234} \propto \Delta\phi_{24}^x$$



$$\Phi_{345} \propto \Delta\phi_{35}^x$$

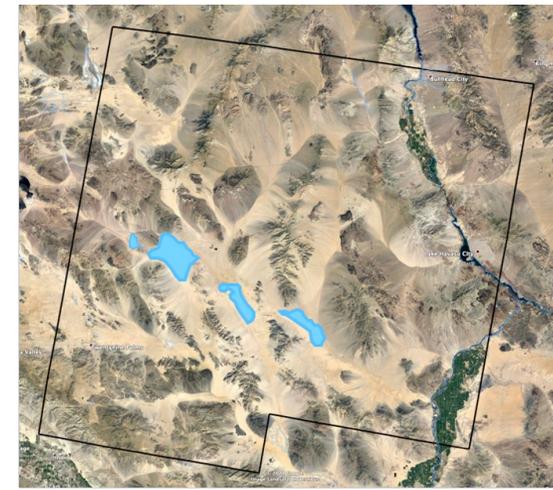
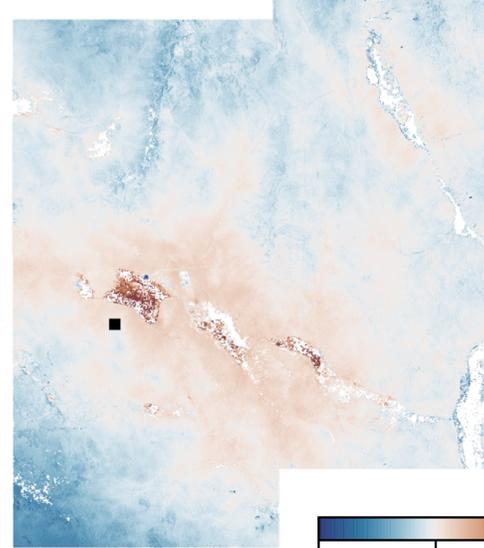
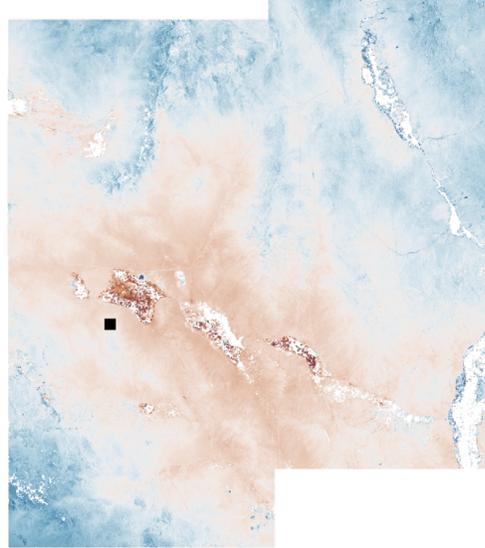
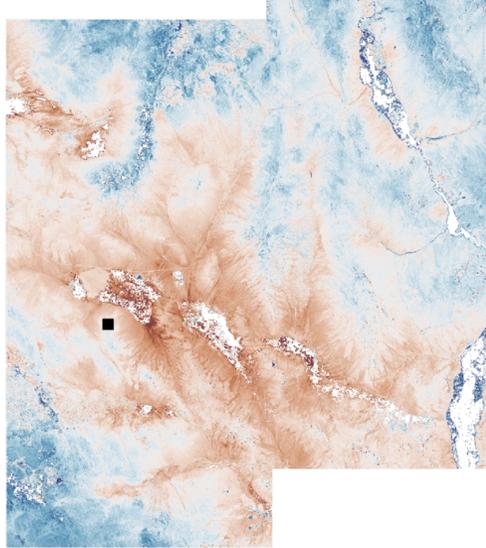
- Sequential Closure phase is only sensitive to temporally inconsistent processes.
- Sequential Closure phase is only sensitive to the phase difference between the first and the last date of the loop.

# Bias Correction with Sequential Closure Phase

$\overline{\Delta t} = 9 \text{ days}$

$\overline{\Delta t} = 27 \text{ days}$

$\overline{\Delta t} = 49 \text{ days}$



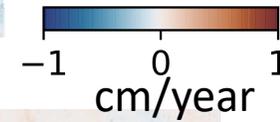
 Sentinel-1A/B

 Barstow-Bristol Trough, CA, United States

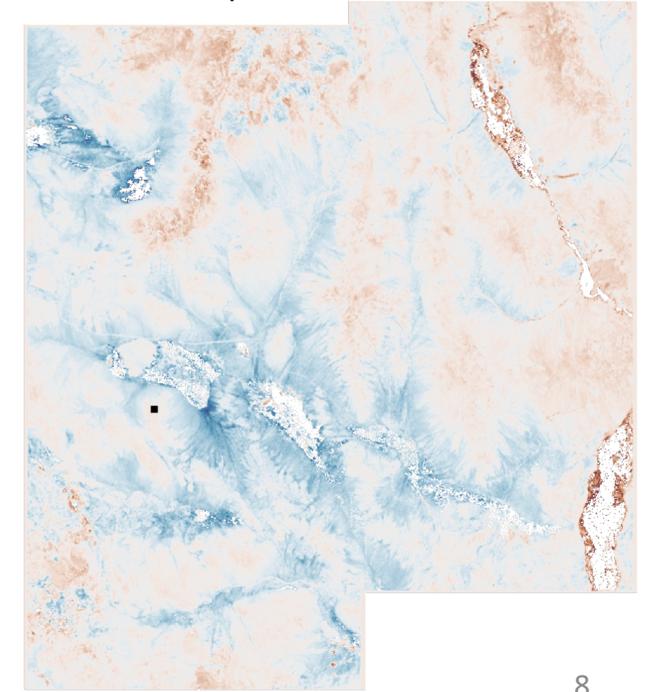
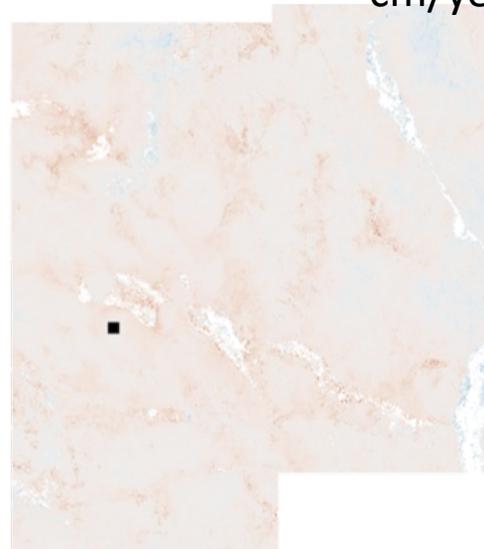
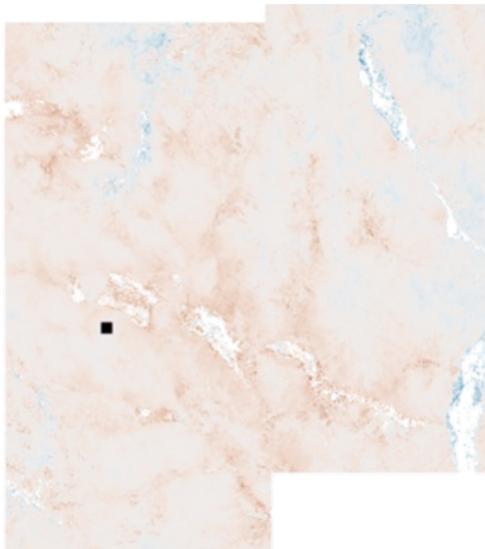
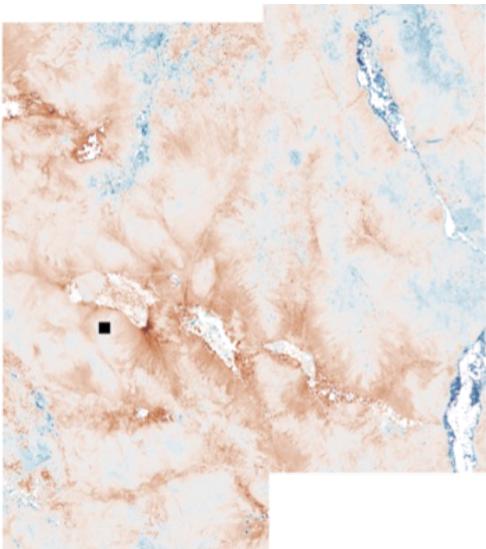
 Feb 2017 - Jan 2021

 SBAS, MintPy

Cumulative Sequential Closure Phase



Estimated Bias



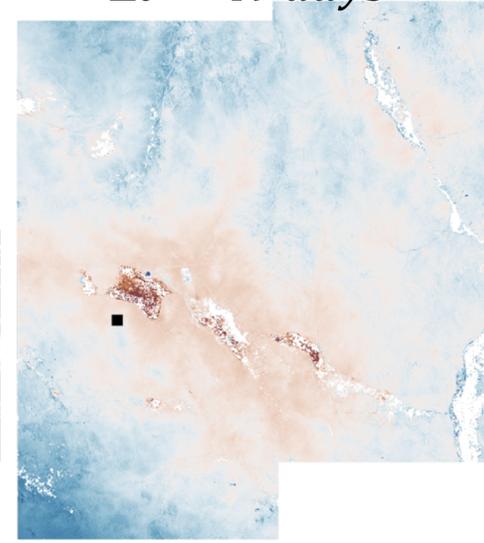
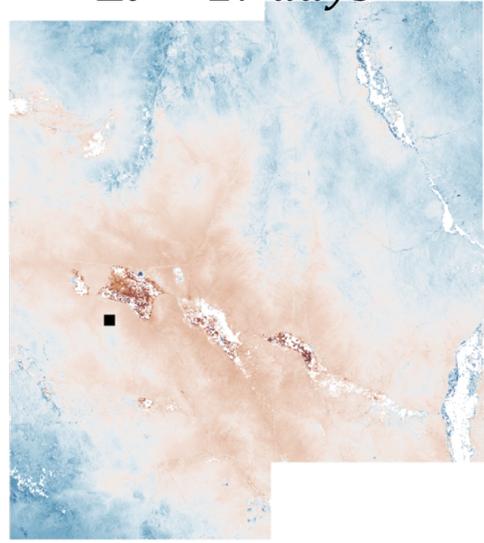
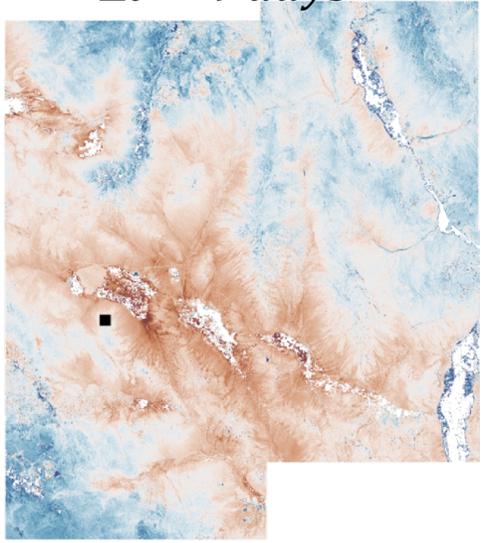
# Bias Correction with Closure Phase

$\overline{\Delta t} = 9 \text{ days}$

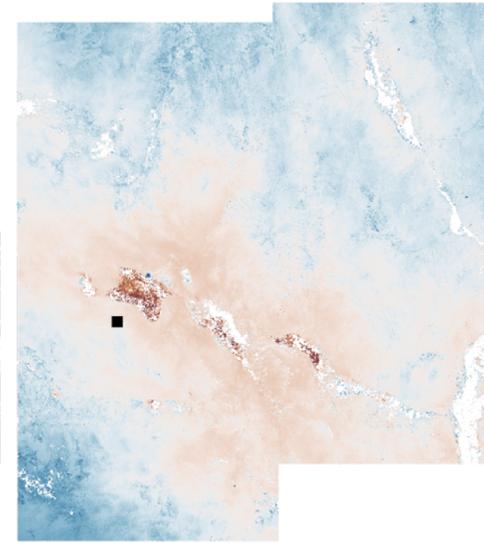
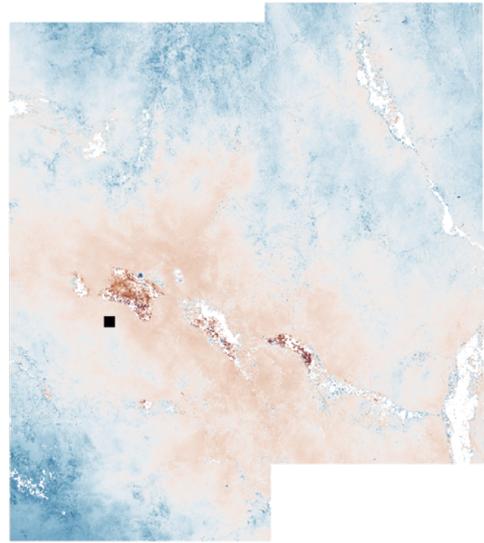
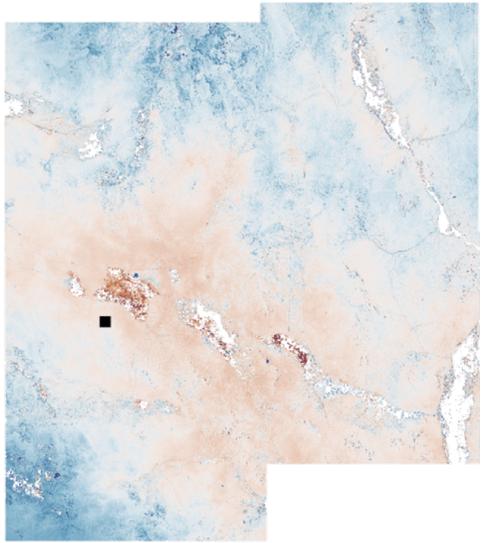
$\overline{\Delta t} = 27 \text{ days}$

$\overline{\Delta t} = 49 \text{ days}$

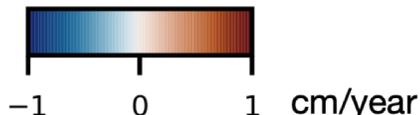
Before Correction



After Correction

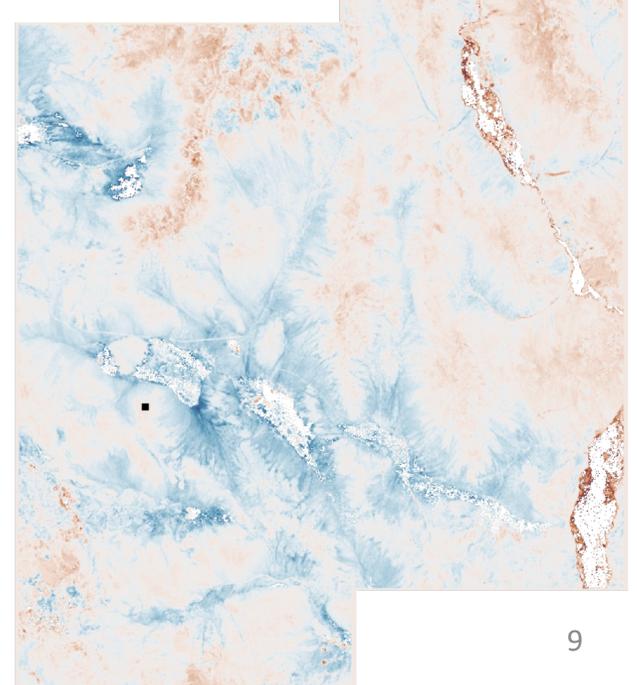


Azimuth  
Range

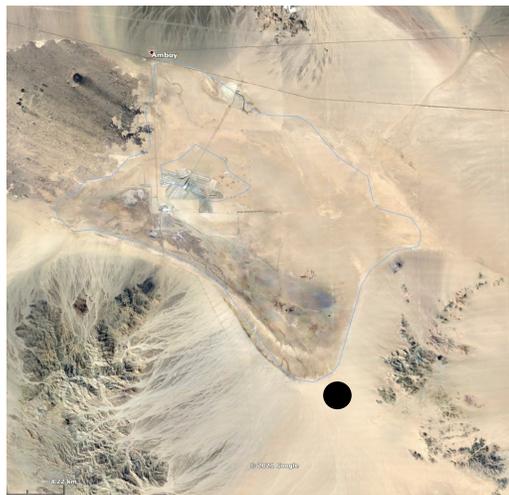


-  Sentinel-1A/B
-  Barstow-Bristol Trough, CA, United States
-  Feb 2017 - Jan 2021
-  SBAS, MintPy

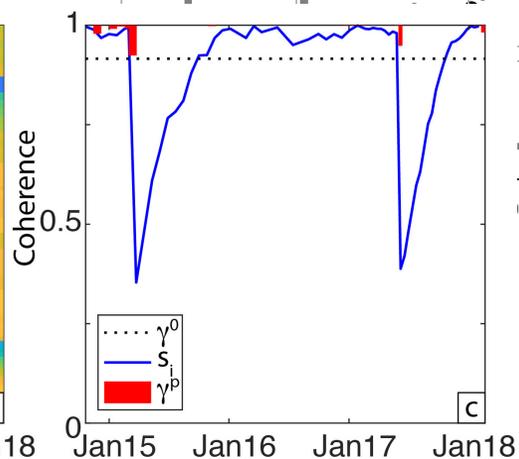
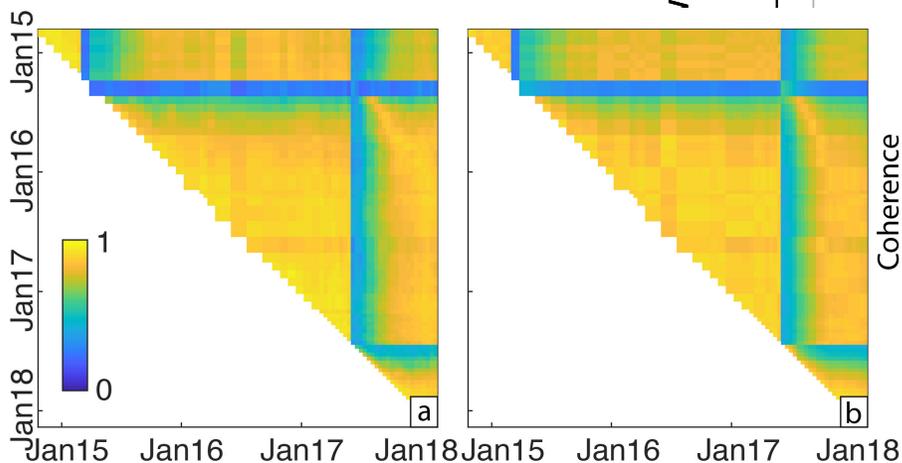
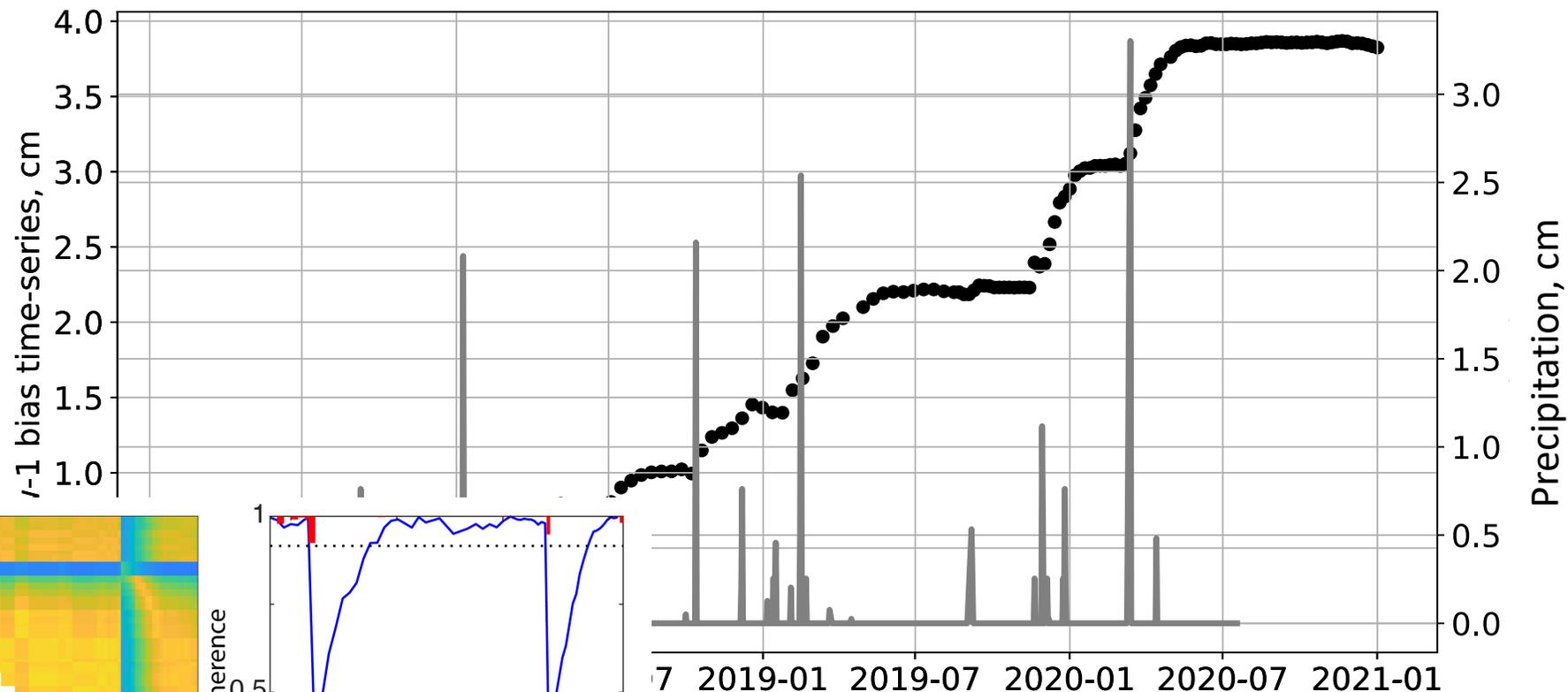
Cumulative Sequential Closure Phase



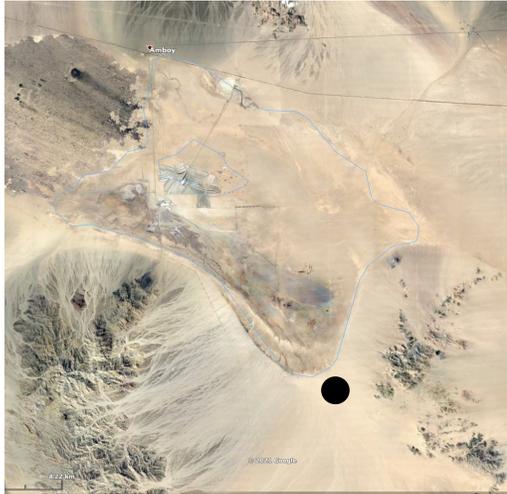
# Bias time-series correlate with cumulative precipitation



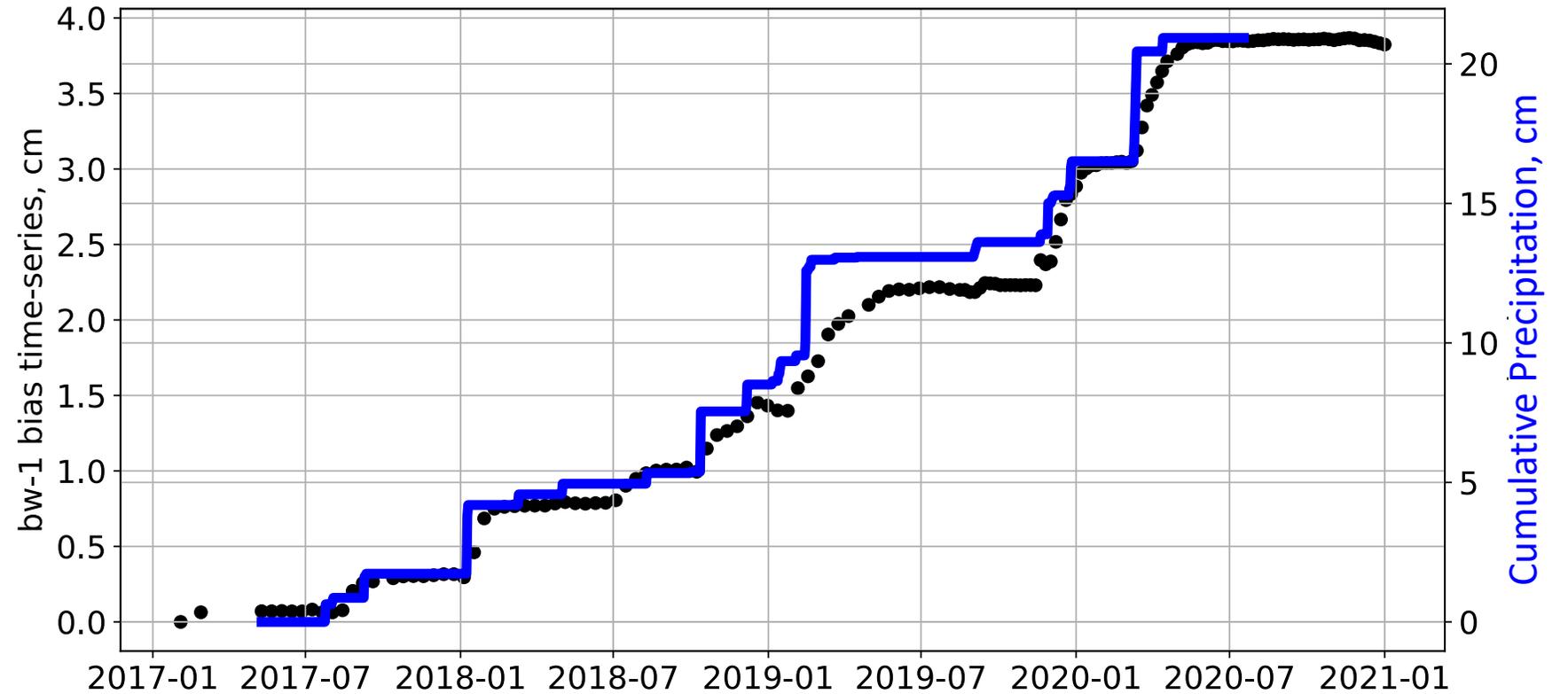
Bristol Dry lake, CA



# Bias time-series correlate with cumulative precipitation



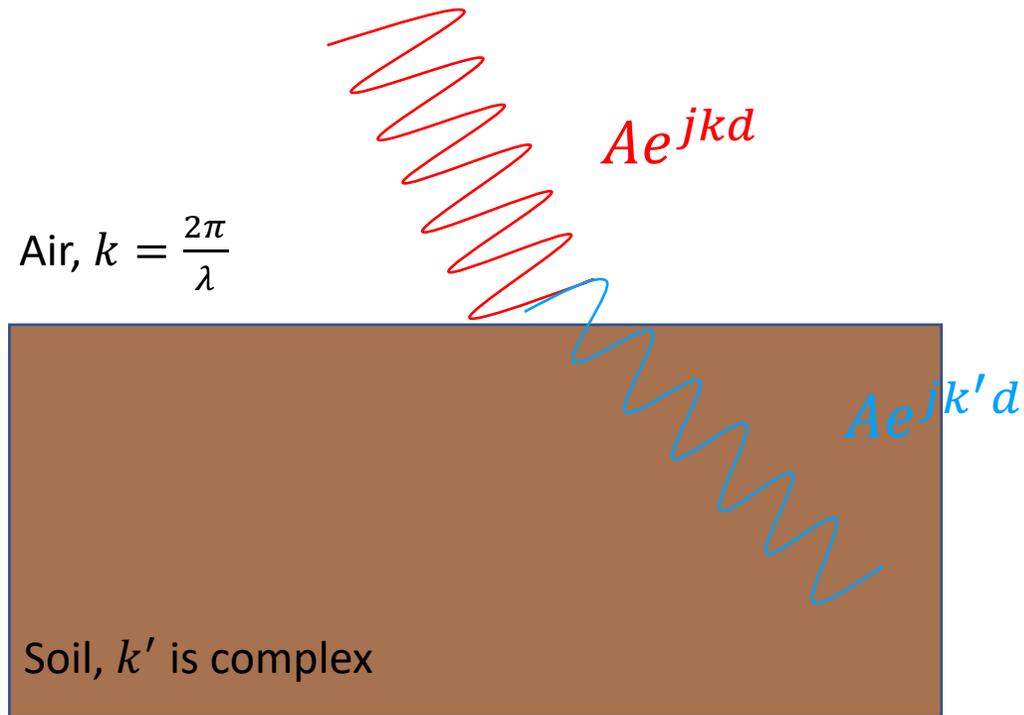
Bristol Dry lake, CA



Closure phase bias: signal or noise?

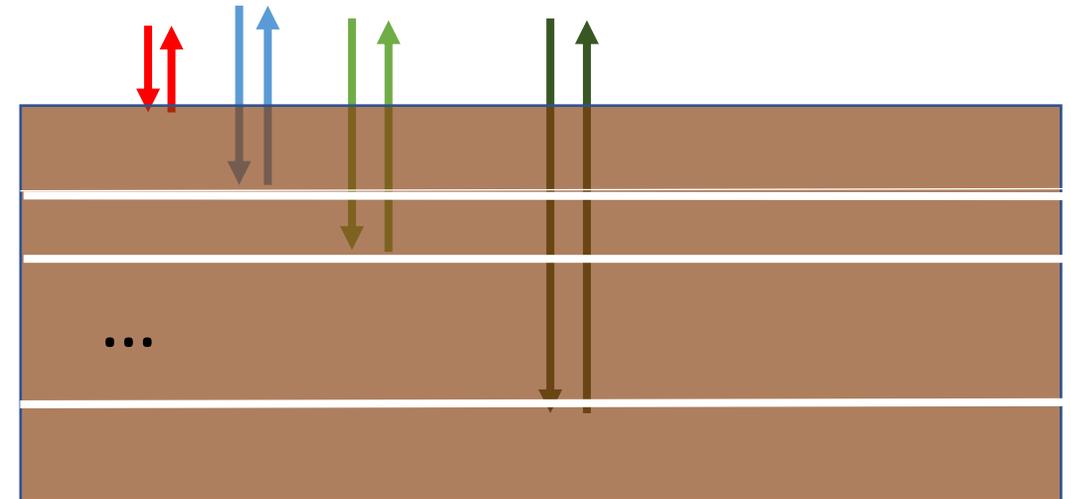
It represents InSAR phase response  
to moisture variation in time ?

# A discrete model for soil moisture



Analytical model for soil moisture  
e.g., De Zan et al., 2014

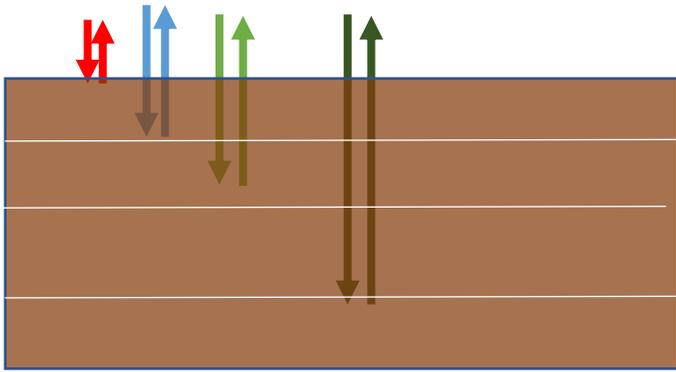
Closed form solution for interferometric phase  
only in simplified scenarios.



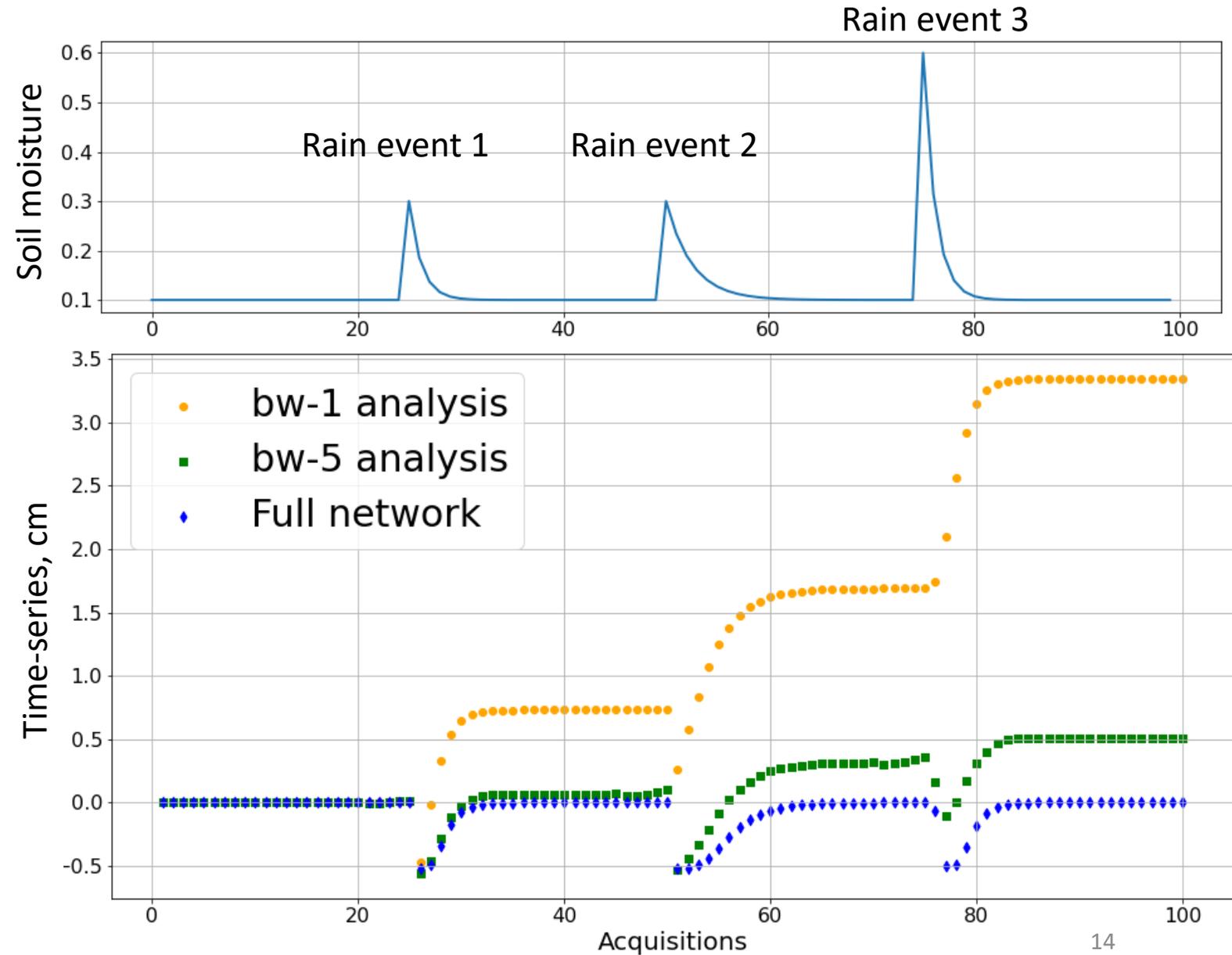
Discretized model for soil moisture

Easy to implement for numerical simulation.  
Can start from single-look radar return.

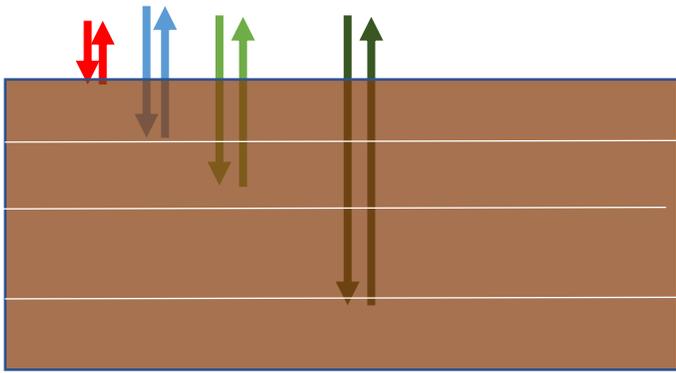
# From soil moisture to closure phase bias : simulation



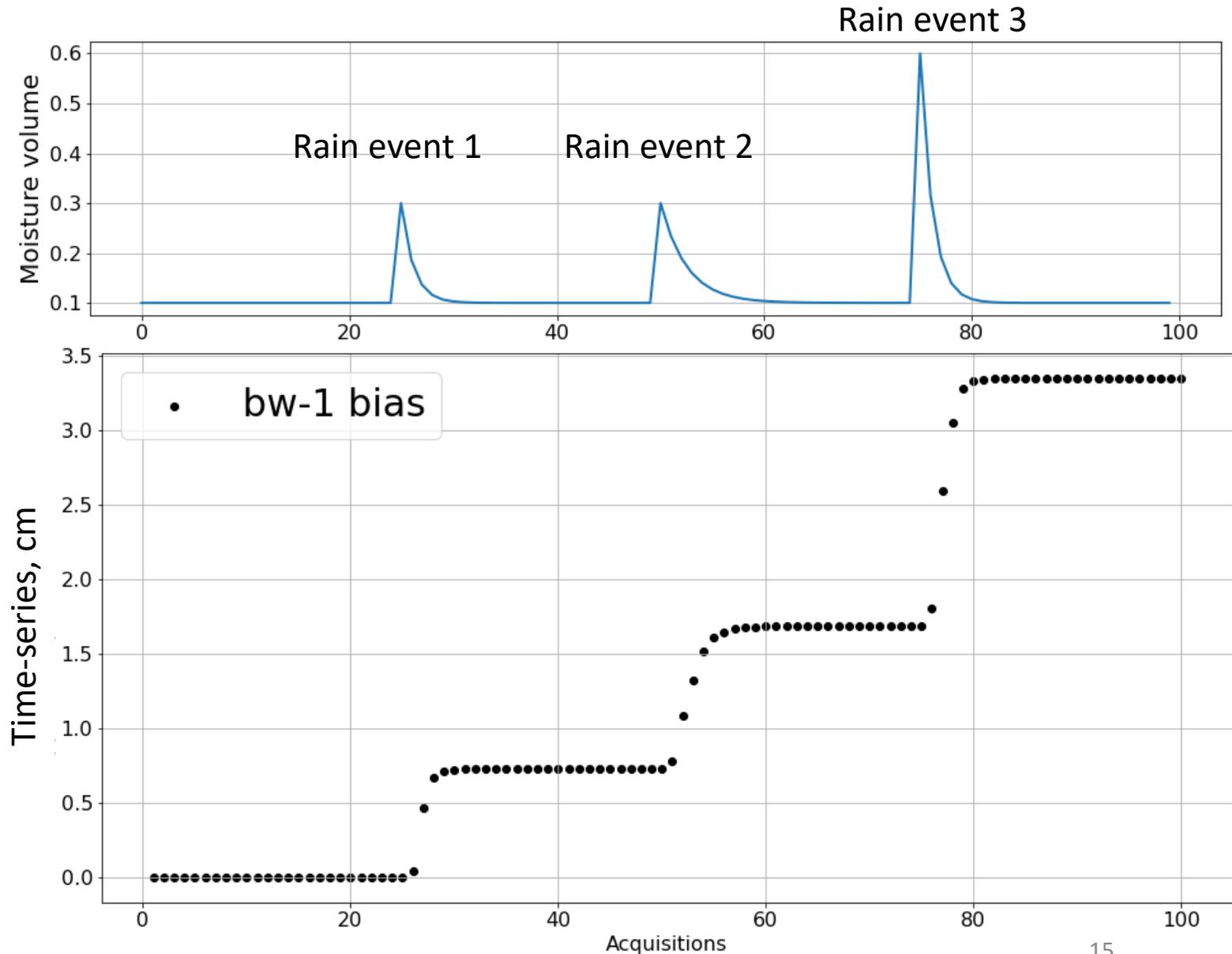
- Step 1: Simulate 100 SAR acquisitions, each acquisition contains 200 pixels
- Step 2: Form interferograms and multi-look by 200
- Step 3: Time-series analysis of different bandwidth



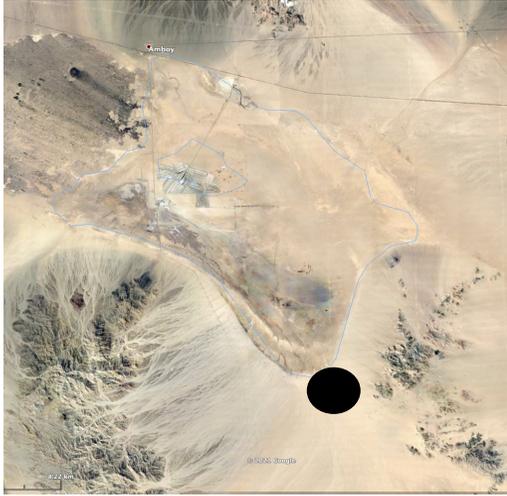
# From soil moisture to closure phase bias : simulation



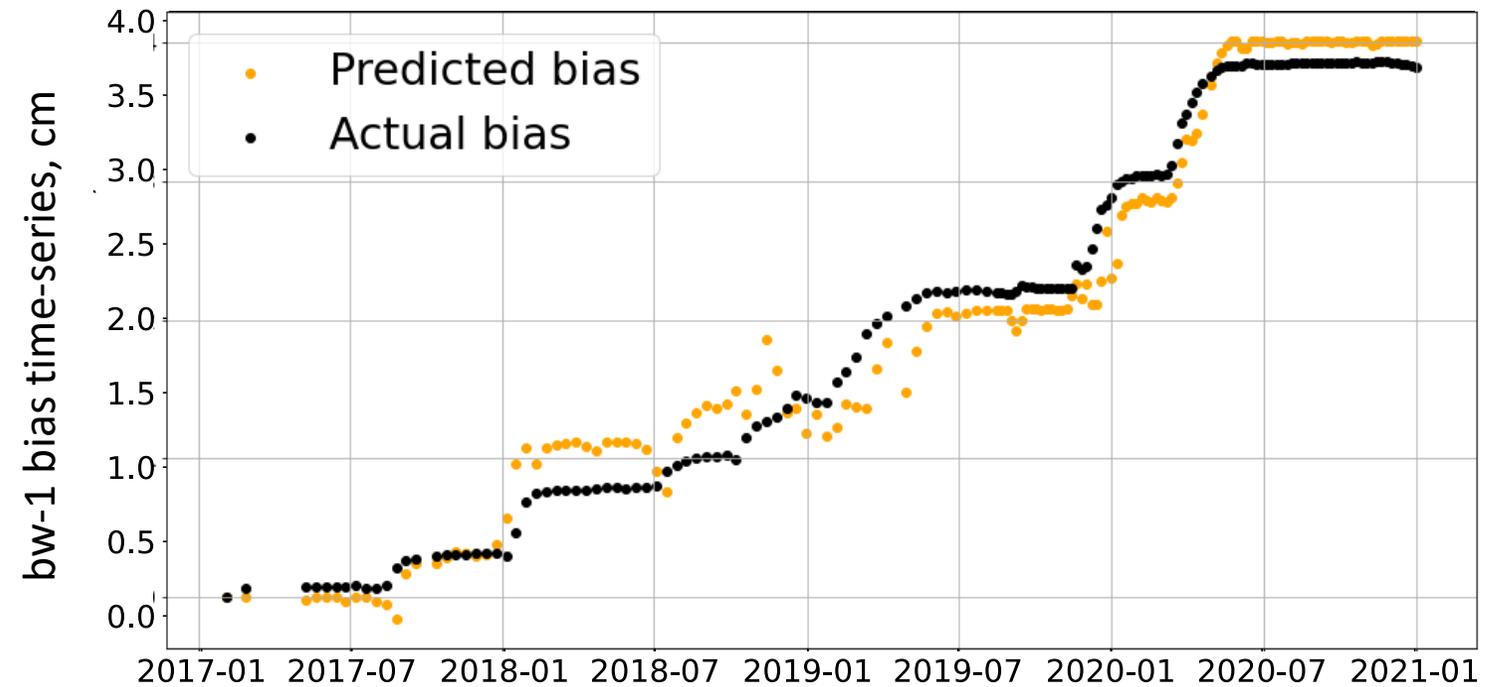
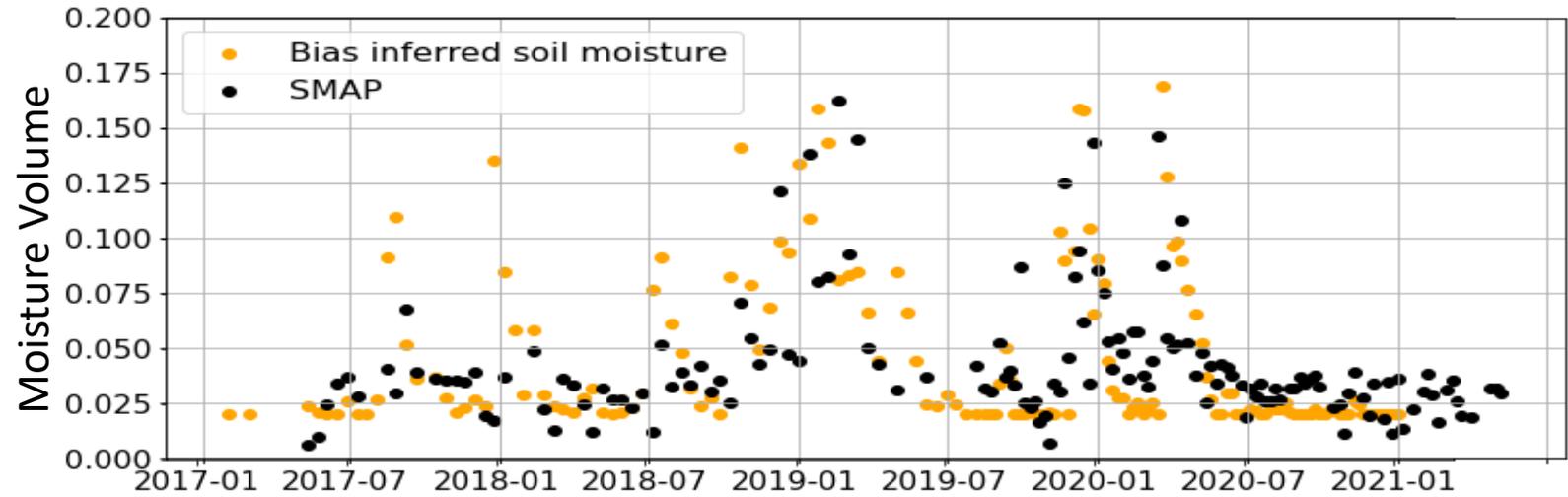
- Step 1: Simulate 100 SAR acquisitions, each acquisition contains 200 pixels
- Step 2: Form interferograms and multi-look by 200
- Step 3: Time-series analysis of different bandwidth



# From closure phase bias to soil moisture ? [Work in progress]



Bristol Dry lake, CA



and

Closure phase bias: signal ~~or~~ noise?

It is noise in the  
context of  
deformation  
modeling.

Zheng et al., (2022), On Closure Phase and Systematic Bias  
in Multi-looked SAR Interferometry

Code:

[https://github.com/insarlab/MintPy/blob/main/mintpy/closure\\_phase\\_bias.py](https://github.com/insarlab/MintPy/blob/main/mintpy/closure_phase_bias.py)

Tutorial (Jupyter notebook)

[https://github.com/insarlab/MintPy-tutorial/blob/main/applications/closure\\_phase\\_bias.ipynb](https://github.com/insarlab/MintPy-tutorial/blob/main/applications/closure_phase_bias.ipynb)



and

Closure phase bias: signal ~~or~~ noise?

It represents InSAR  
phase response to  
moisture variation.

InSAR is known to be sensitive to soil moisture in terms of :

- Amplitude
- Coherence
- Phase
  - Triplets
  - Closure phase bias time-series

Future looks very promising!