

# Estimating Peatland Surface Motion With Discontinuous InSAR Time Series Data

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# Challenges

- Ex: Extensometer measurement



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- **Strong deformation rates**



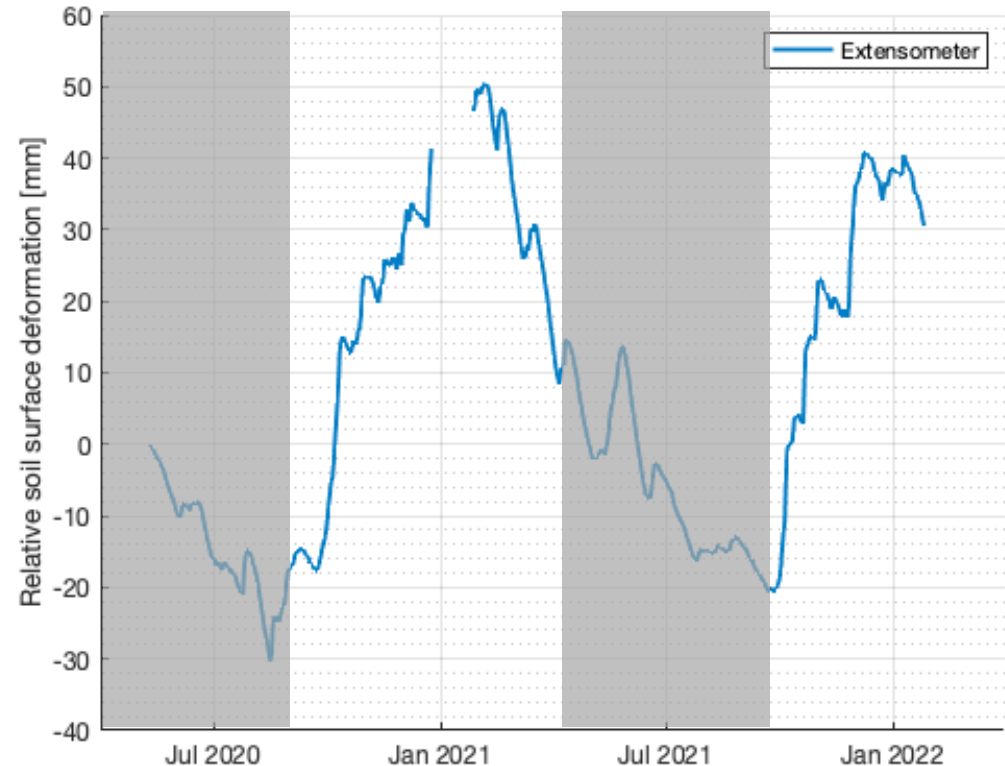
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- Ex: Extensometer measurement
- Strong deformation rates
- High dynamic range

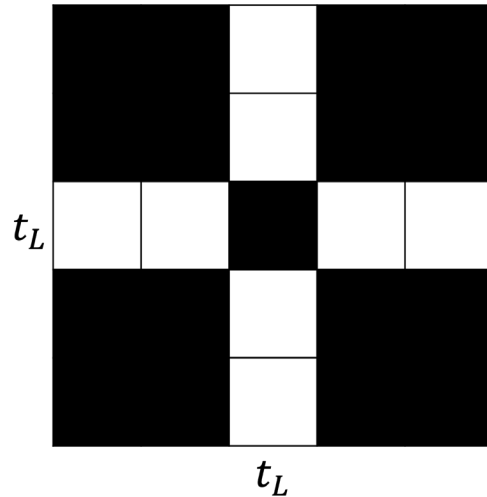


# Challenges

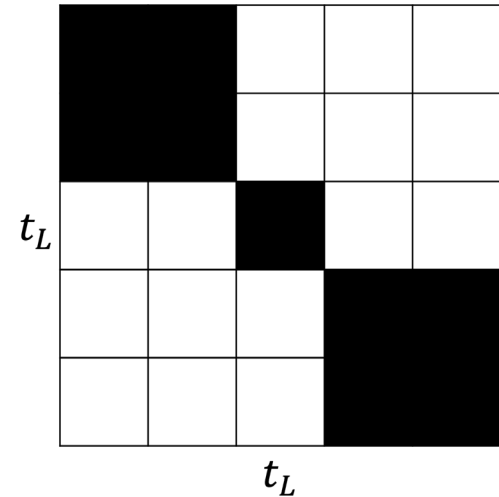
- Ex: Extensometer measurement
- Strong deformation rates
- High dynamic range
- **Loss of coherence in summer**



# Loss-of-Lock



Intermittent loss of coherence  
(ex. short snowfall)

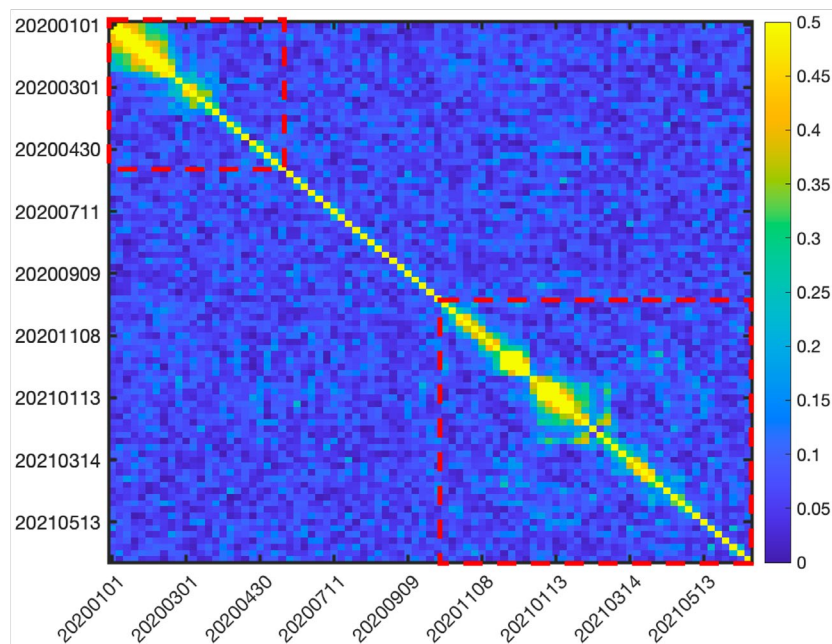


Loss-of-lock  
(ex. plowing, harvesting)

# Loss-of-Lock in Spring/Summer

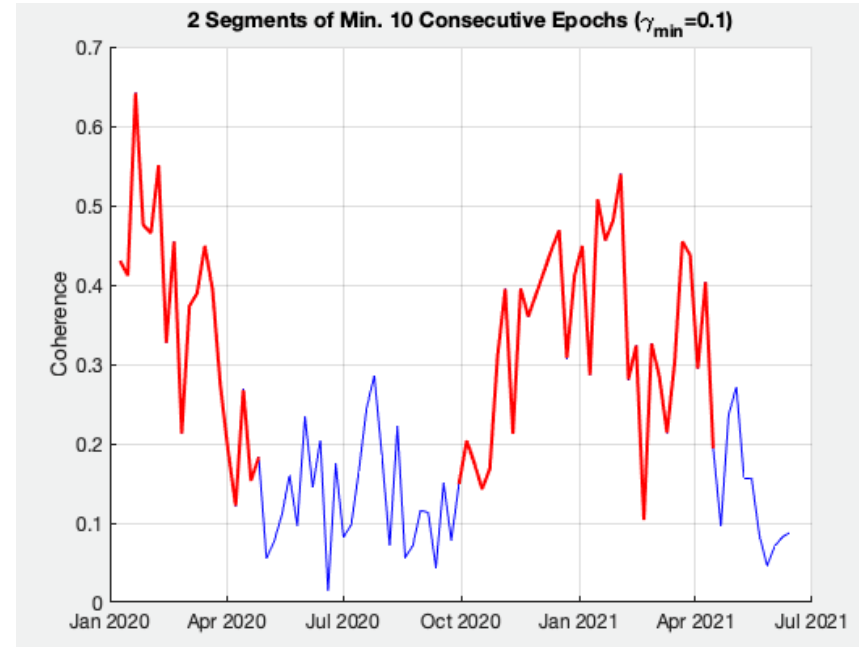
- InSAR observations of Dutch grasslands commonly show a complete loss of coherence in the spring and summer
- Practically speaking, this sustained long-term loss of coherence results in a cutting of the time series into disconnected segments

Typical Coherence Matrix (Sentinel-1)



# Segmentation by Coherence

- We identify coherent time series segments where we are confident in the data quality
- Each segment is treated as an independent time series
- We can unwrap the time series with an acceptable level of error within the segment<sup>1</sup>
  - ~90% success rate at  $\gamma = 0.1$
  - ~98% success rate at  $\gamma = 0.2$

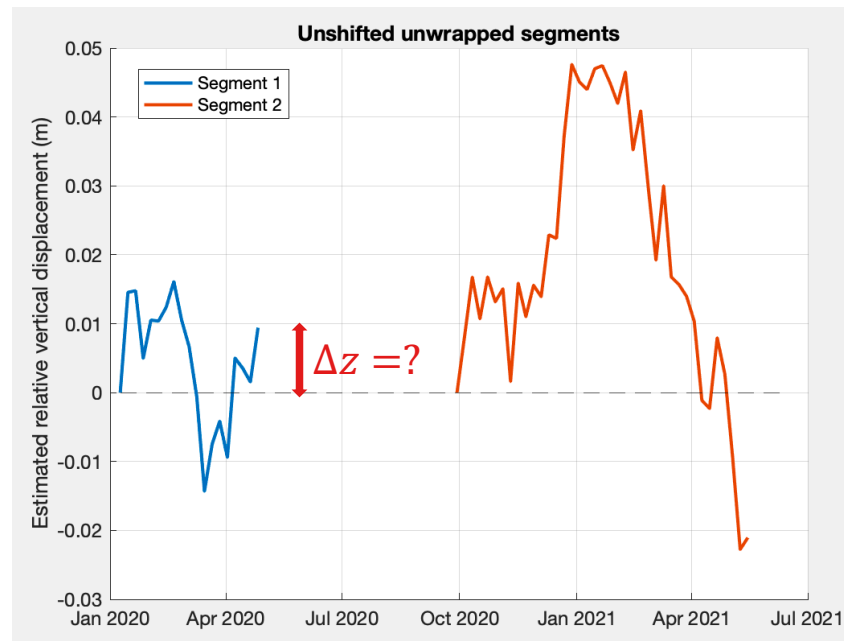


<sup>1</sup> *Probabilistic Estimation of InSAR Displacement Phase Guided by Contextual Information and Artificial Intelligence*, IEEE Transactions on Geoscience and Remote Sensing, 2022.



# Partial Time Series Reconstruction

- We obtain an unwrapped time series for each segment
- Displacement is referenced to the first epoch
- How to reconnect the segments?



# Contextual Data Integration



▼ zegveld_parcel_attributes_full [4]	
▼ objectid	1646282
▶ (Derived)	
▶ (Actions)	
objectid	1646282
gewascateg	Grasland
gewas	Grasland,blijvend
gewascode	265
length	766.330184259988982
area	20757.373033329498867
objectid_2	NULL
aanid	27336
versiebron	luchtfoto
type	BTR-landbouw
soi_unit_	hVb
ahn_05_dsm	-2.428999901000000
ghg_mbgl	NULL
glg_mbgl	0.8 - 1.0
EERSTE_BOD	hVb
EERSTE_GWT	II

*Parcels form a natural averaging (multilooking) “unit”*

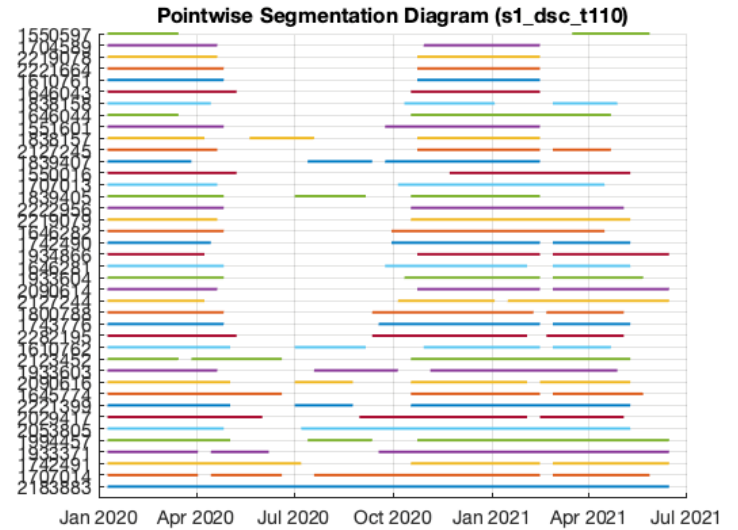
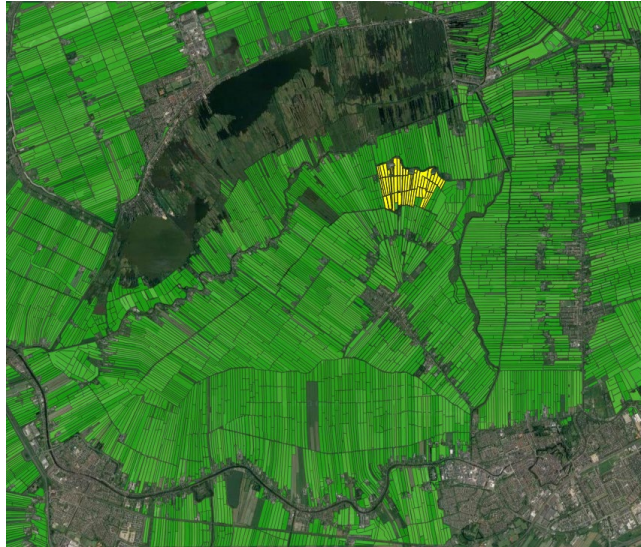
# Grouping Observations



Key parameters:

- Land cover
- Soil type
- Water management zone (“Peilgebied”)

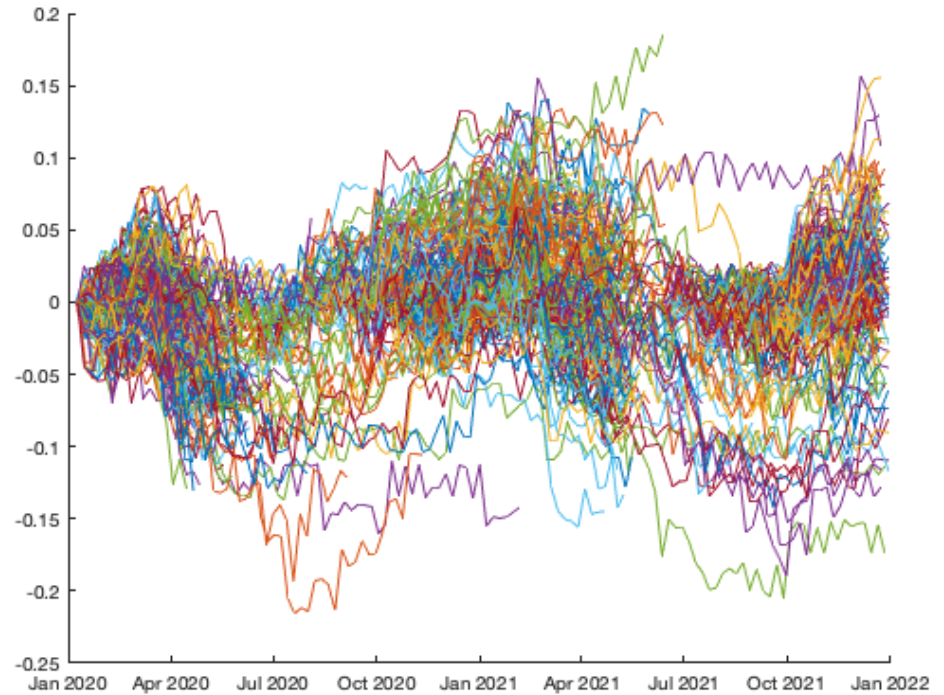
# Filling in the Gaps



*Enough coherent data to fill in the missing gaps!*

# Model Estimation

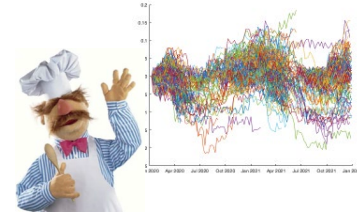
- Many vertically unaligned segments



# Model Estimation

- Many **vertically unaligned** segments:

$$\phi_n(t) = \frac{4\pi \cos \theta}{\lambda} \cdot [M(x, t) + \Delta z_n] + \epsilon$$



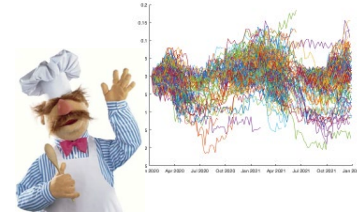
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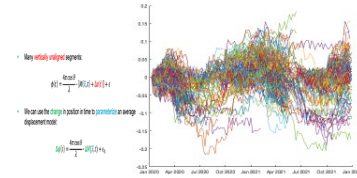
$$\phi_n(t) = \frac{4\pi \cos \theta}{\lambda} \cdot [M(x, t) + \Delta z_n] + \epsilon$$

- We can use the **change** in position in time to **parameterize** an average displacement model:

$$\Delta\phi_n(t) = \frac{4\pi \cos \theta}{\lambda} \cdot \Delta M(x, t) + \epsilon_\Delta$$



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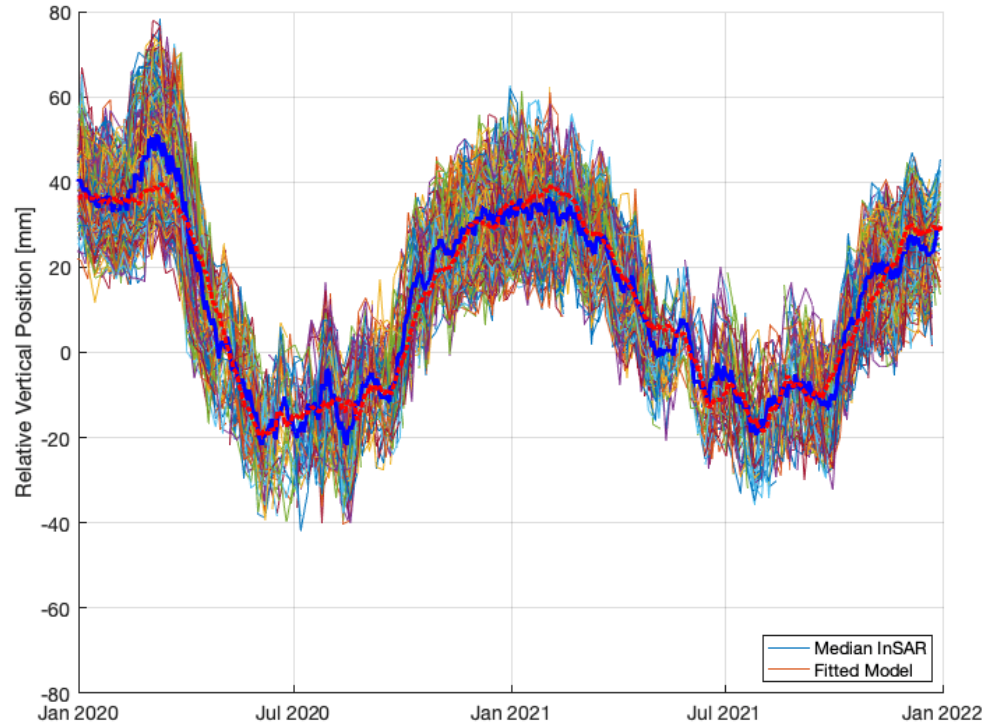
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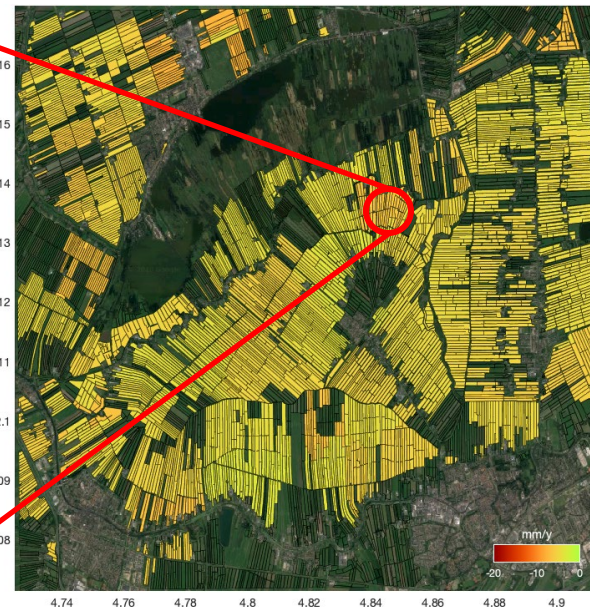
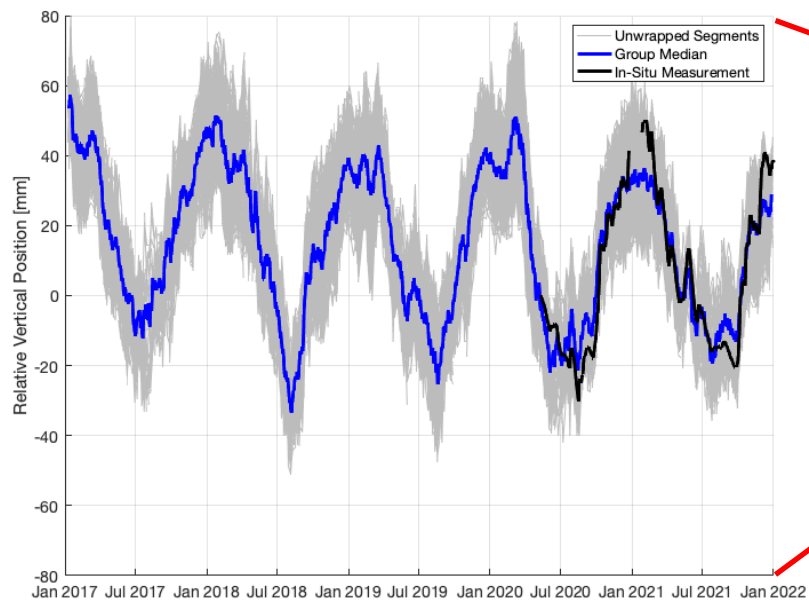
# Model Estimation

- Many unaligned segments
- We can use the change in position over time to parameterize an average displacement model
- Estimated model can be used to *realign* the segments



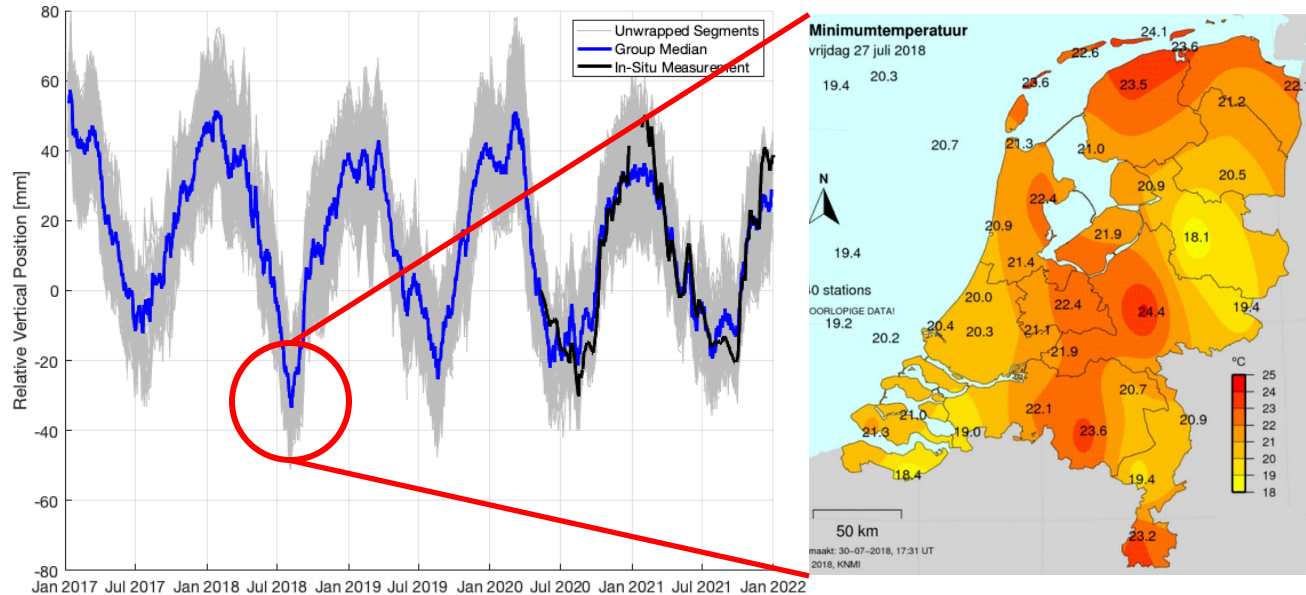
# Displacement Time Series

Zegveld, NL



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# Conclusions

- Loss-of-lock cuts the InSAR time series into disconnected segments
- Contextually similar scatterers are used to estimate a mean displacement model
- The effects of climate stresses are visible in the ground subsidence
- *First accurate time series of surface motion of the Dutch peatlands!*

Check out the preprints!



InSAR Workflow



Soil Model