

# Integrating Sentinel-2 information into a growth model for assessing Alpine grassland dynamics under climate change

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# Climate Change in Switzerland: Key Messages

+2.5°C to +4.5°C  
Summer temperature

-25% to +10%  
Summer precipitation

+0 to +9 days  
Longest dry period in summer

Winter: +10% Summer: +10%  
Heaviest single-day  
precipitation event of the year

Winter: +10% Summer: +20%  
100-year single-day  
precipitation event

Source:

<https://www.nccs.admin.ch/>

+3 to +17  
Very hot days  
(currently one day per summer on average)

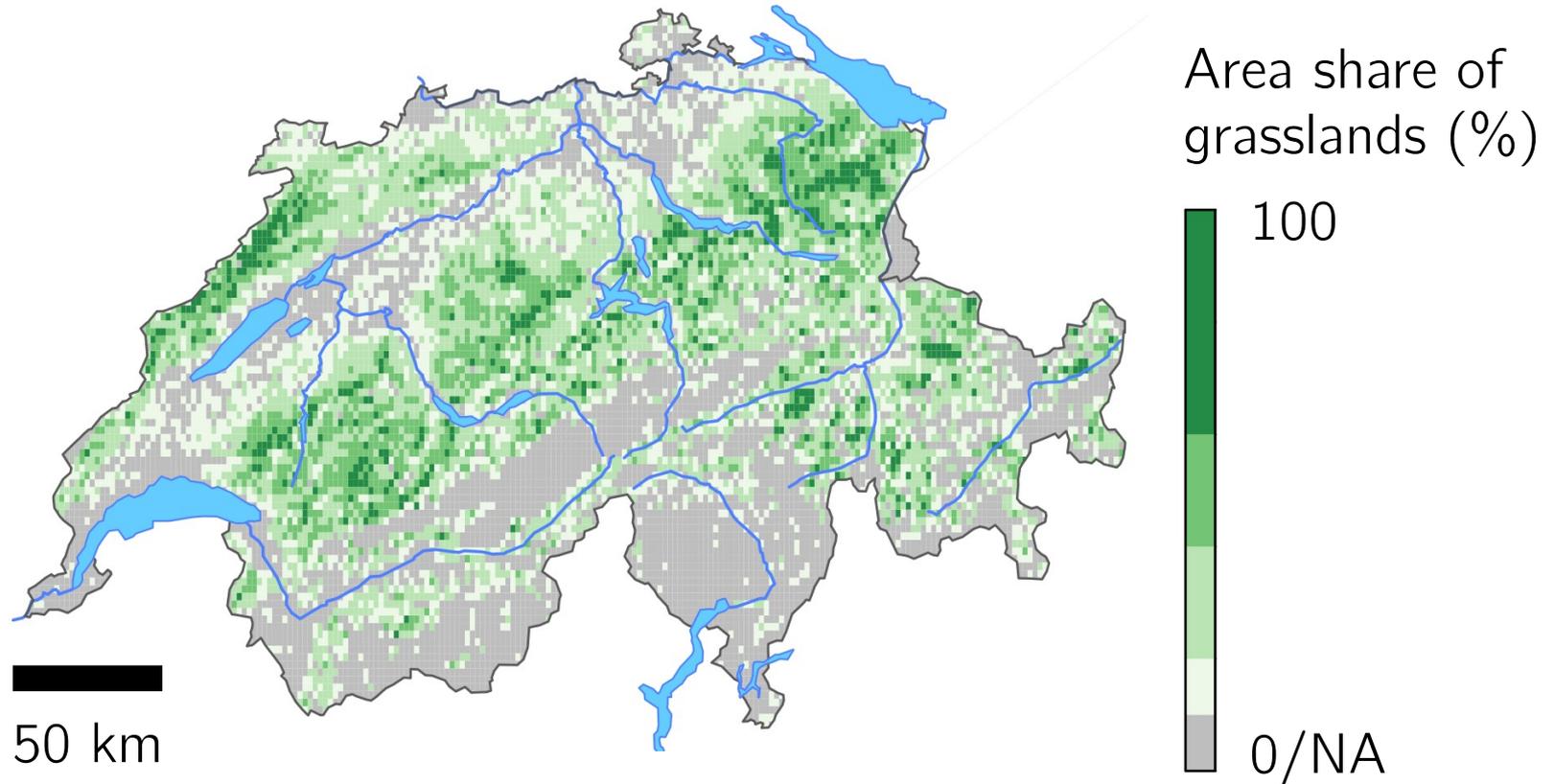
+2°C to +5.5°C  
Hottest day of the year

400 m to 650 m  
Increase in elevation of the  
zero-degree line in winter

+2°C to +3.5°C  
Winter temperature



# Switzerland Is a *Grass Land*



## Grass Growth Model: ModVege

- ✓ Few inputs required, understandable mechanisms
- ✓ Verified for Central Europe
  - Jouven, M. *et al.* Grass and Forage Science 61, no. 2 (2006): 112–24.
  - Calanca, P. *et al.* Field Crops Research 187 (2016): 12–23.

👉 Published as R package on CRAN  
<https://kuadrat.github.io/growR/>



# Model Calibration and Validation: Experimental Sites

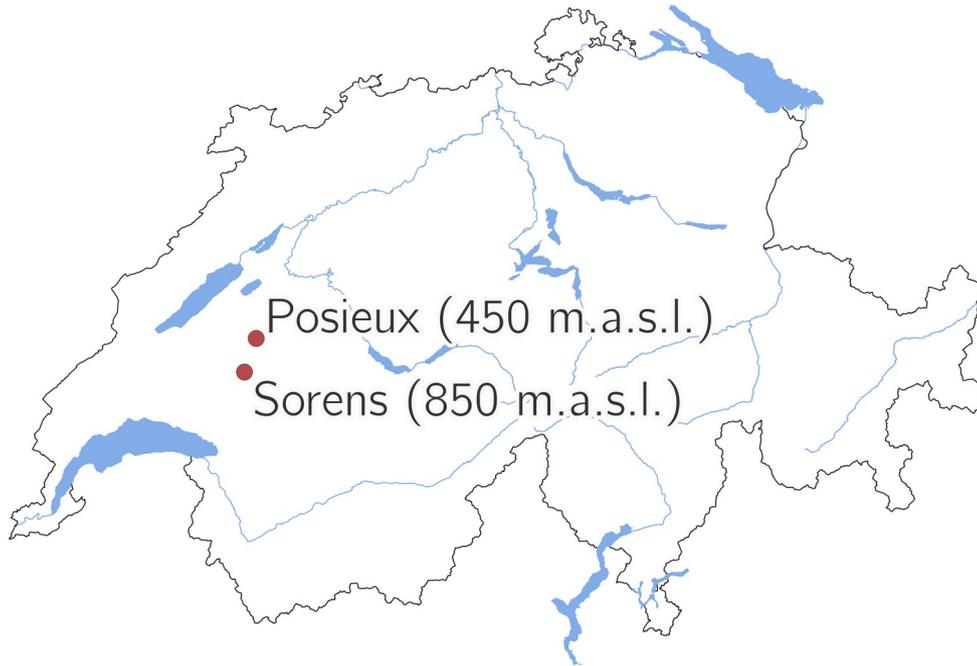


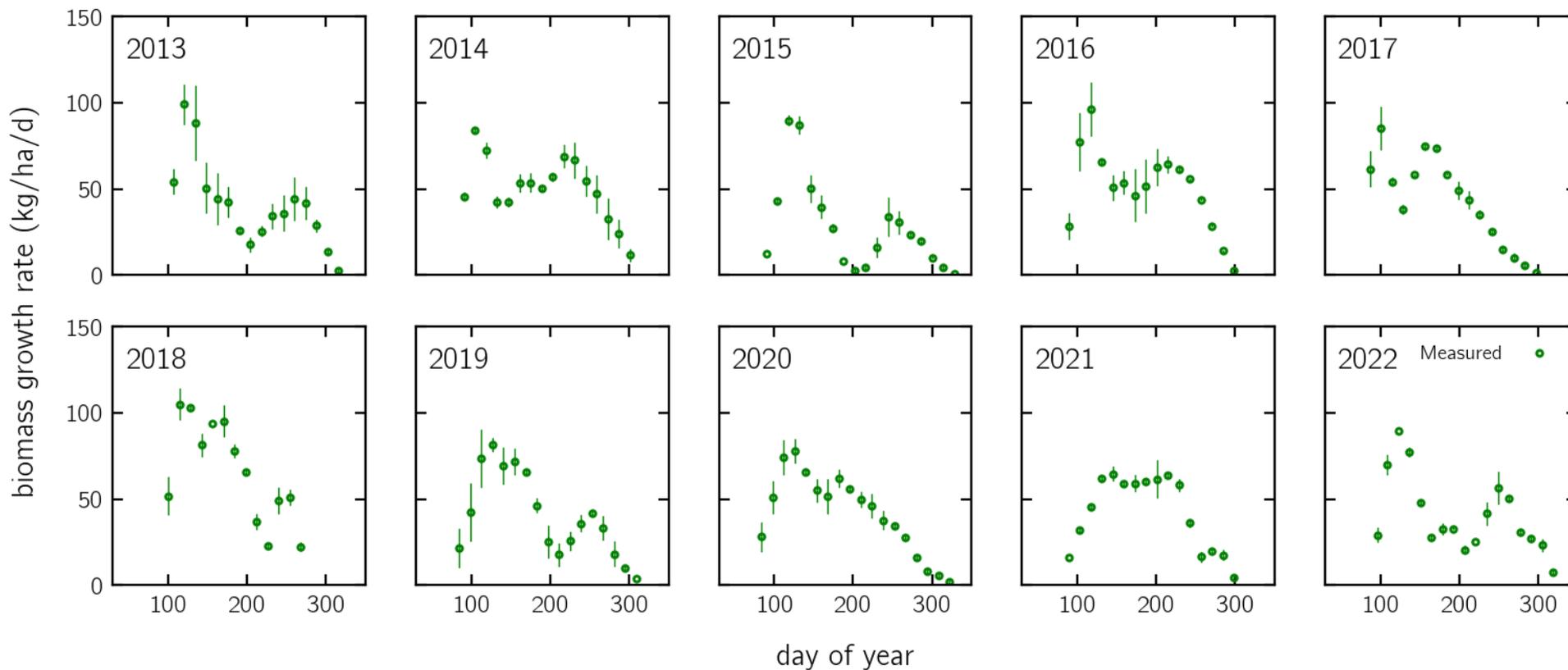
Image and data kindly provided by Fredy Schori:

<https://www.agroscope.admin.ch/agroscope/de/home/services/dienste/futtermittel/weidemanagement/graswachstum.html>

# Model Validation



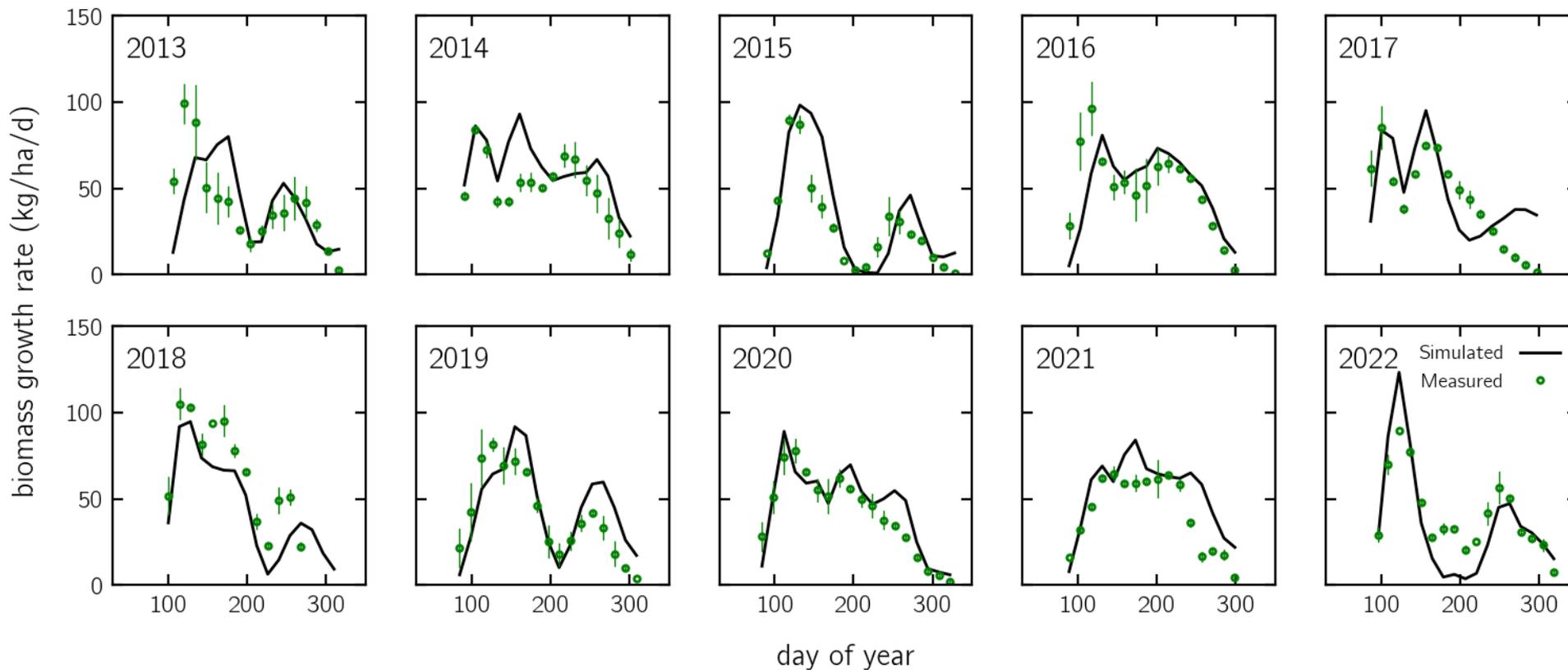
Posieux



# Model Validation



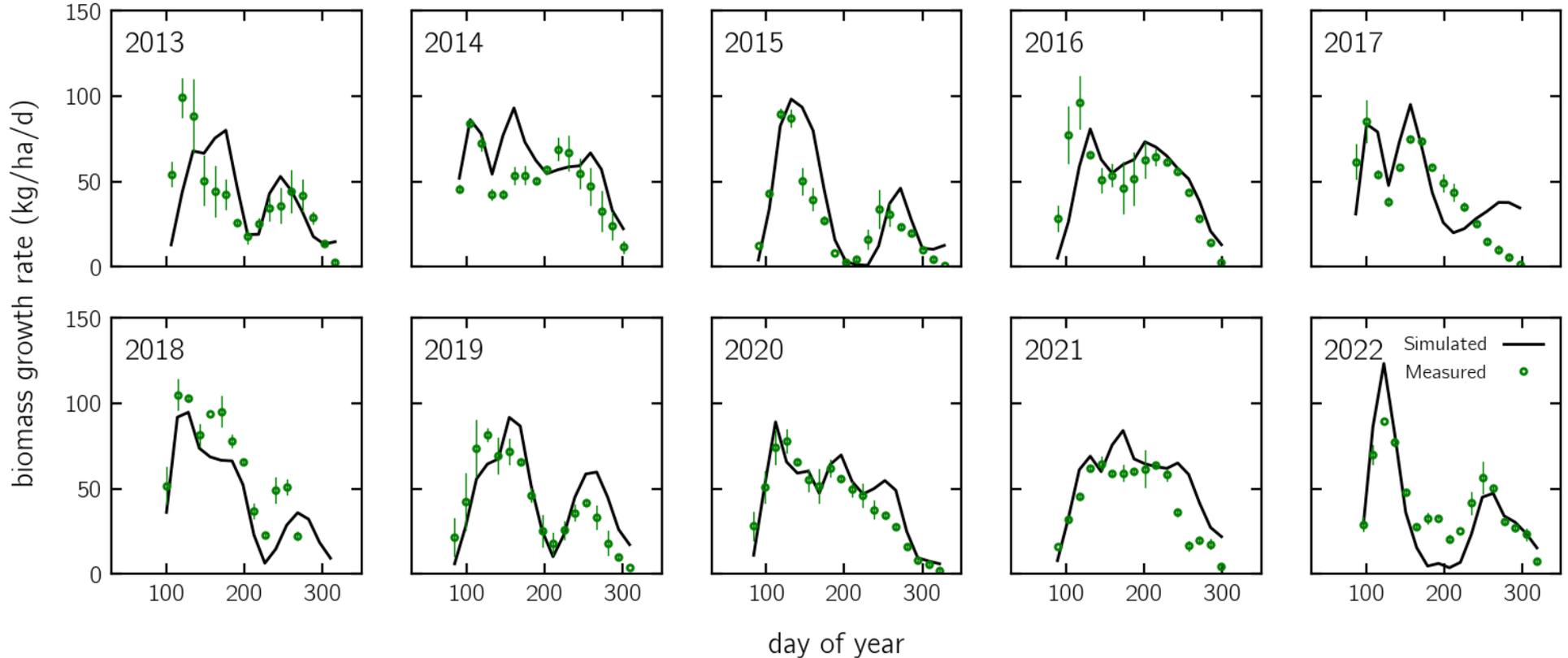
Posieux



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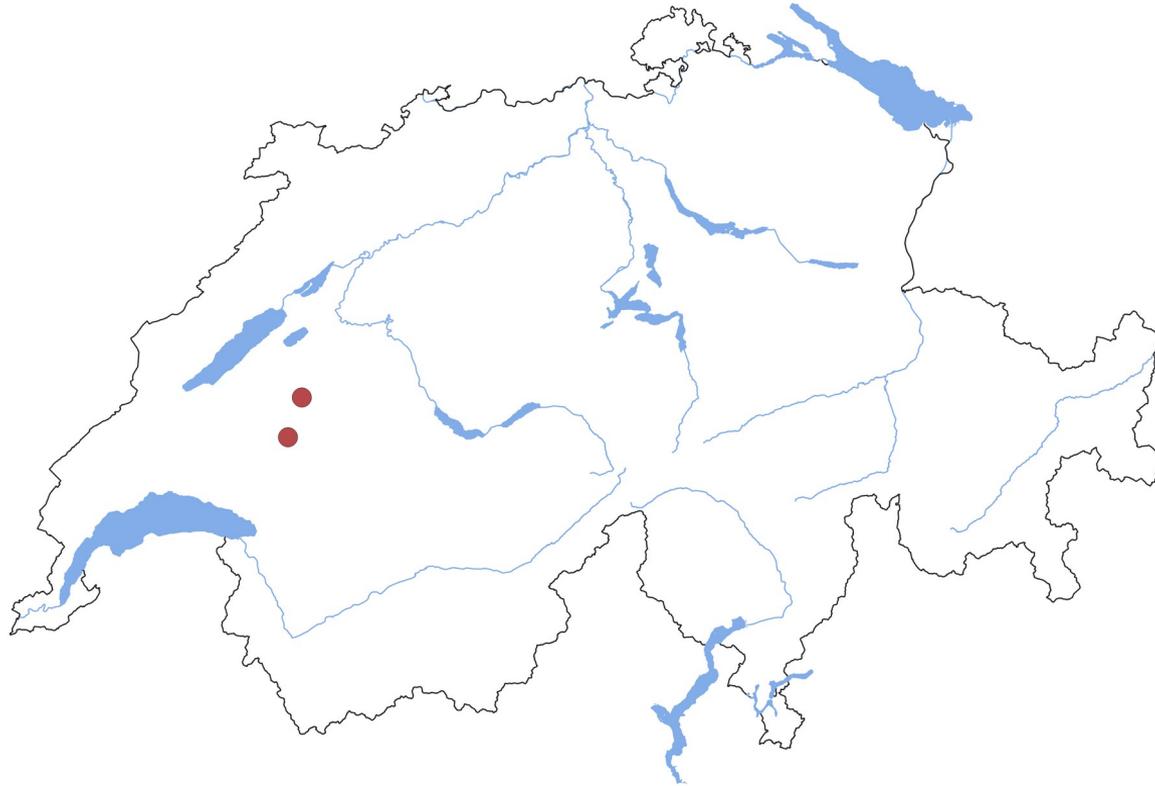


Posieux

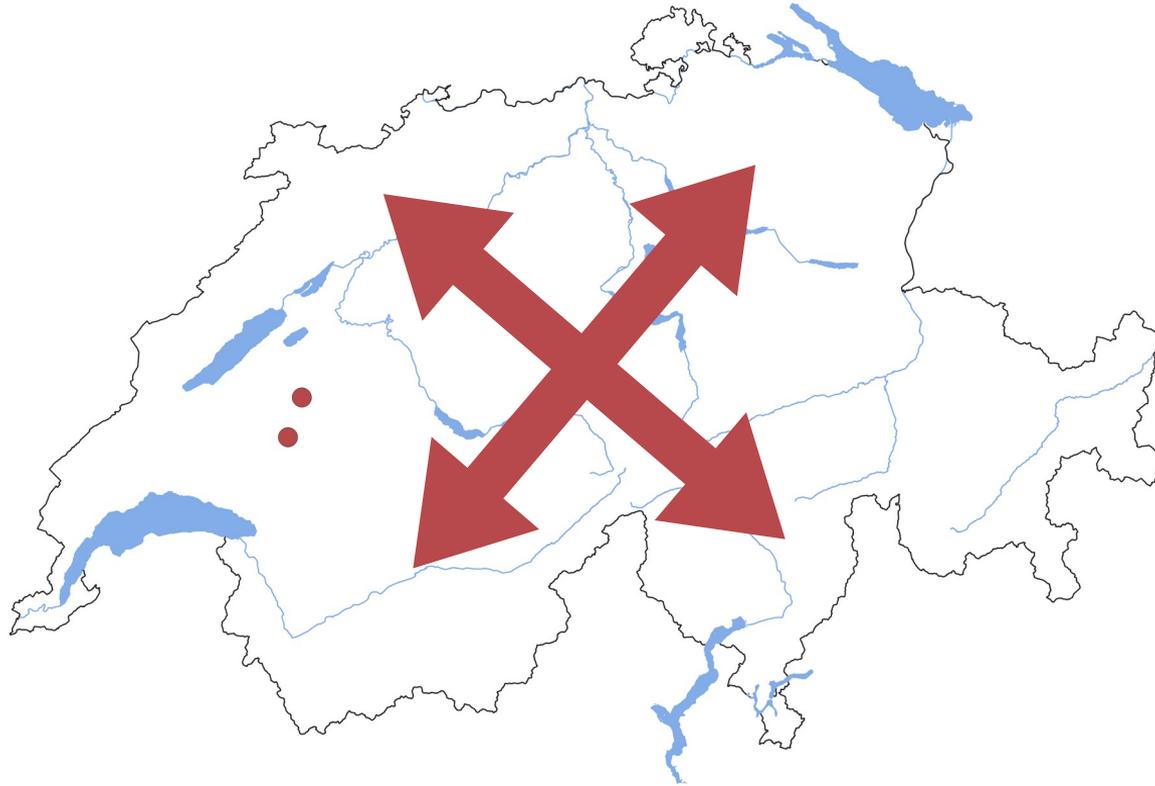


→ Calibrated model captures grass growth dynamics very well.

# Problem: Extension Across Switzerland



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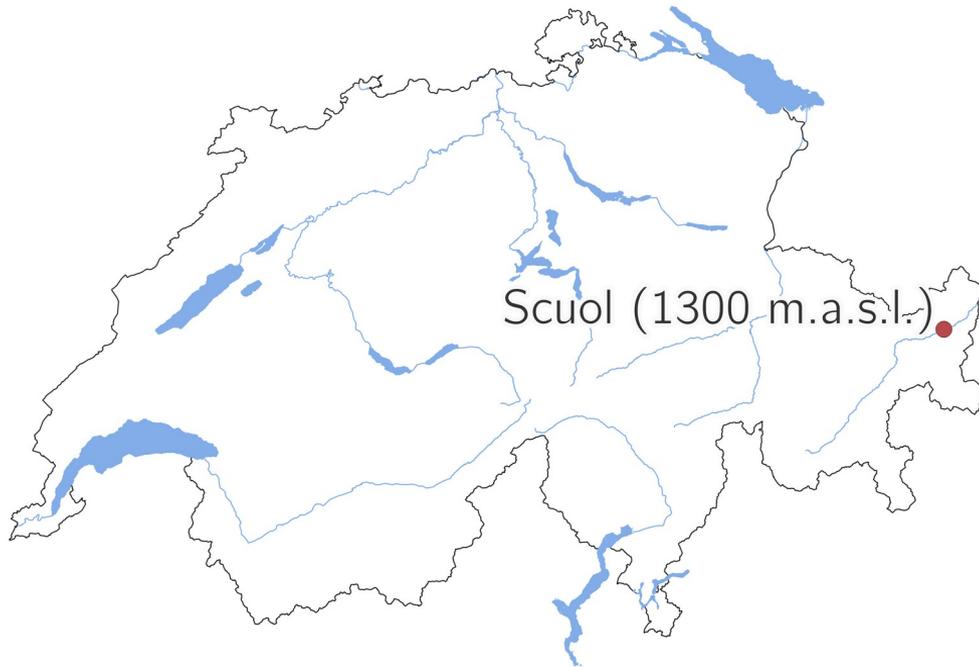
How to assess if the model works in biogeoclimatically different regions? 8

# Enter Remote Sensing

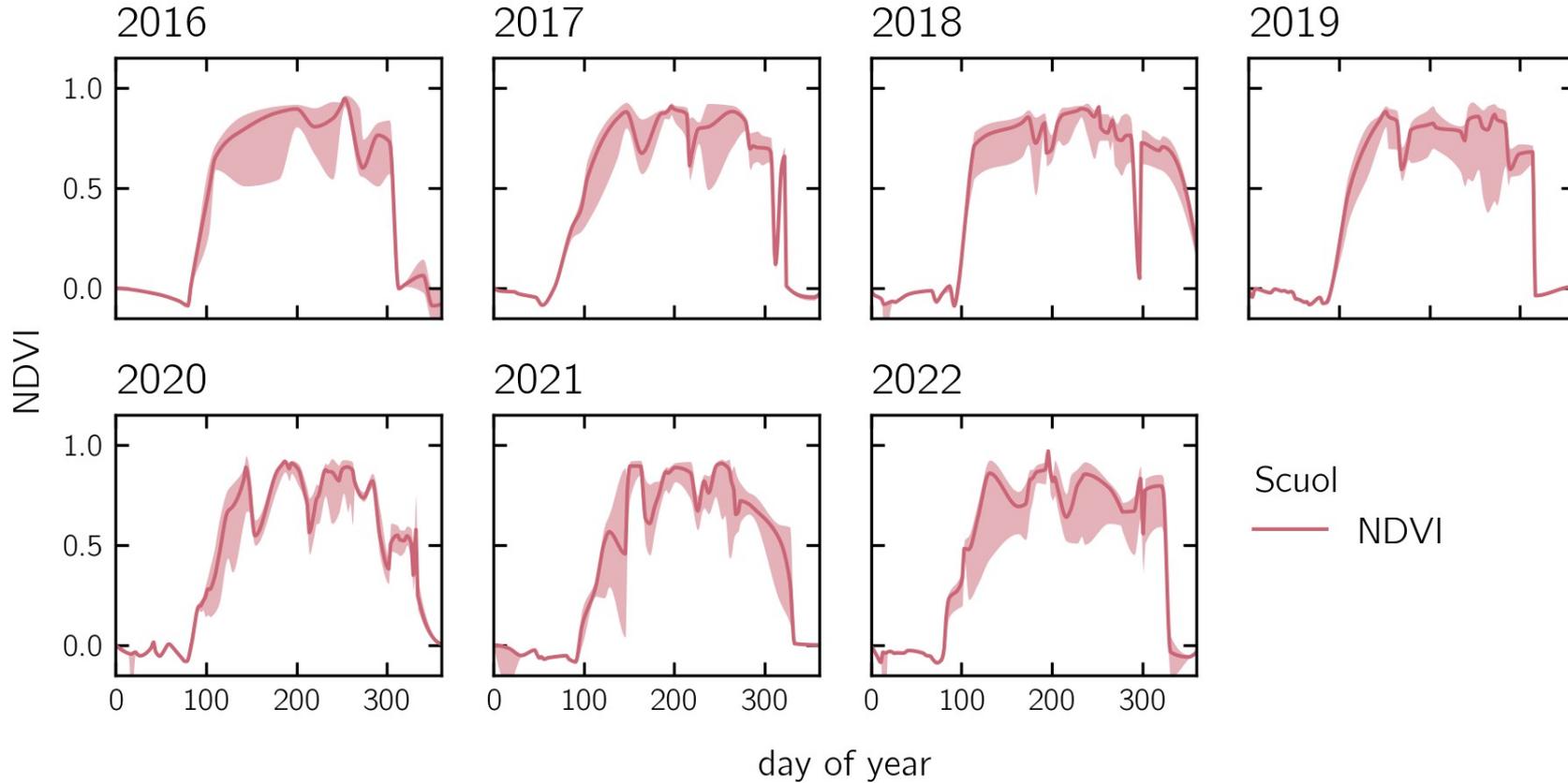
**Idea:**

Use a growth proxy from satellite imagery to inform model calibration.

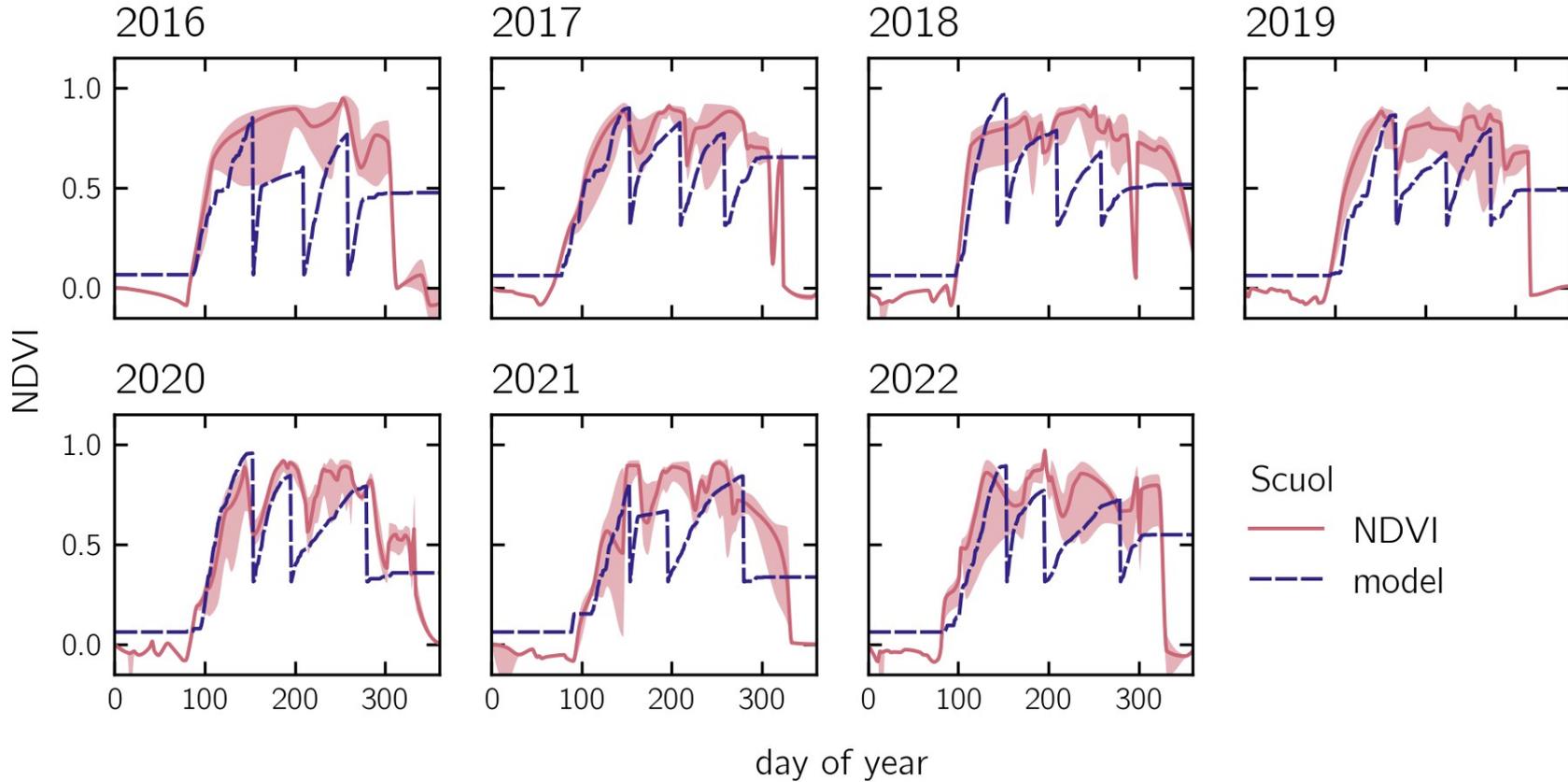
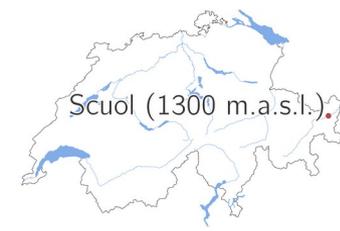
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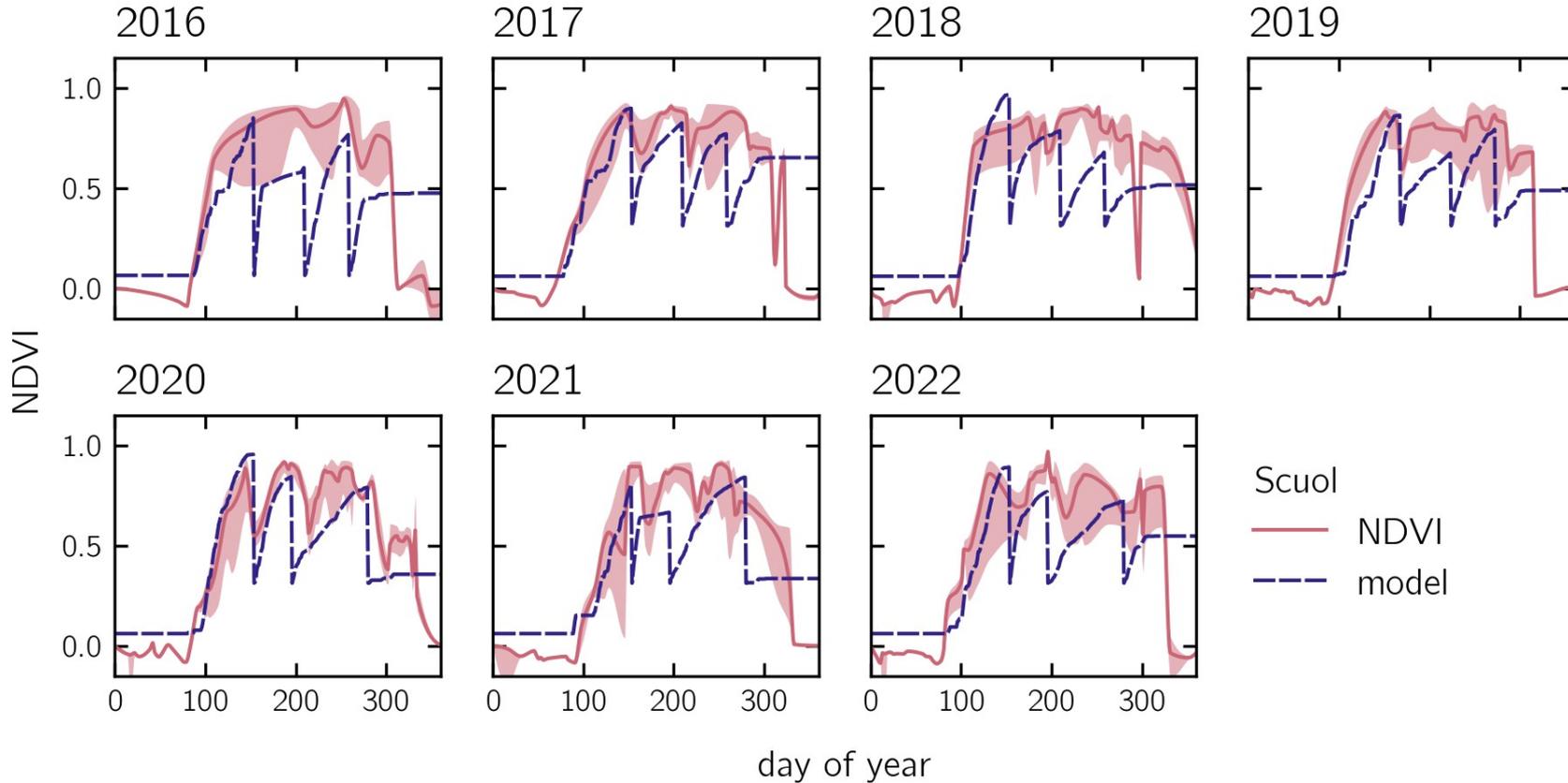
# NDVI and Model – Alpine Region



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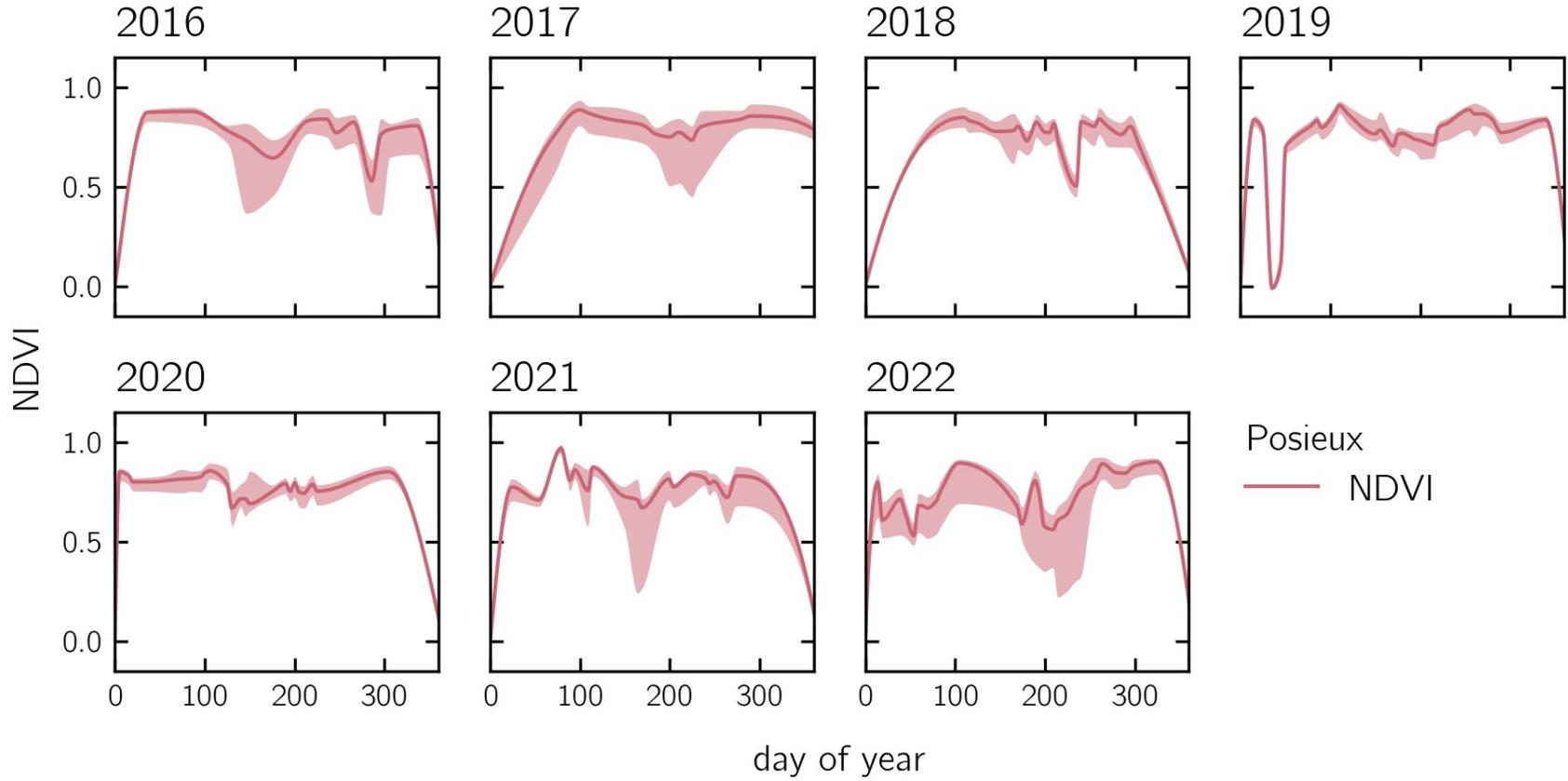


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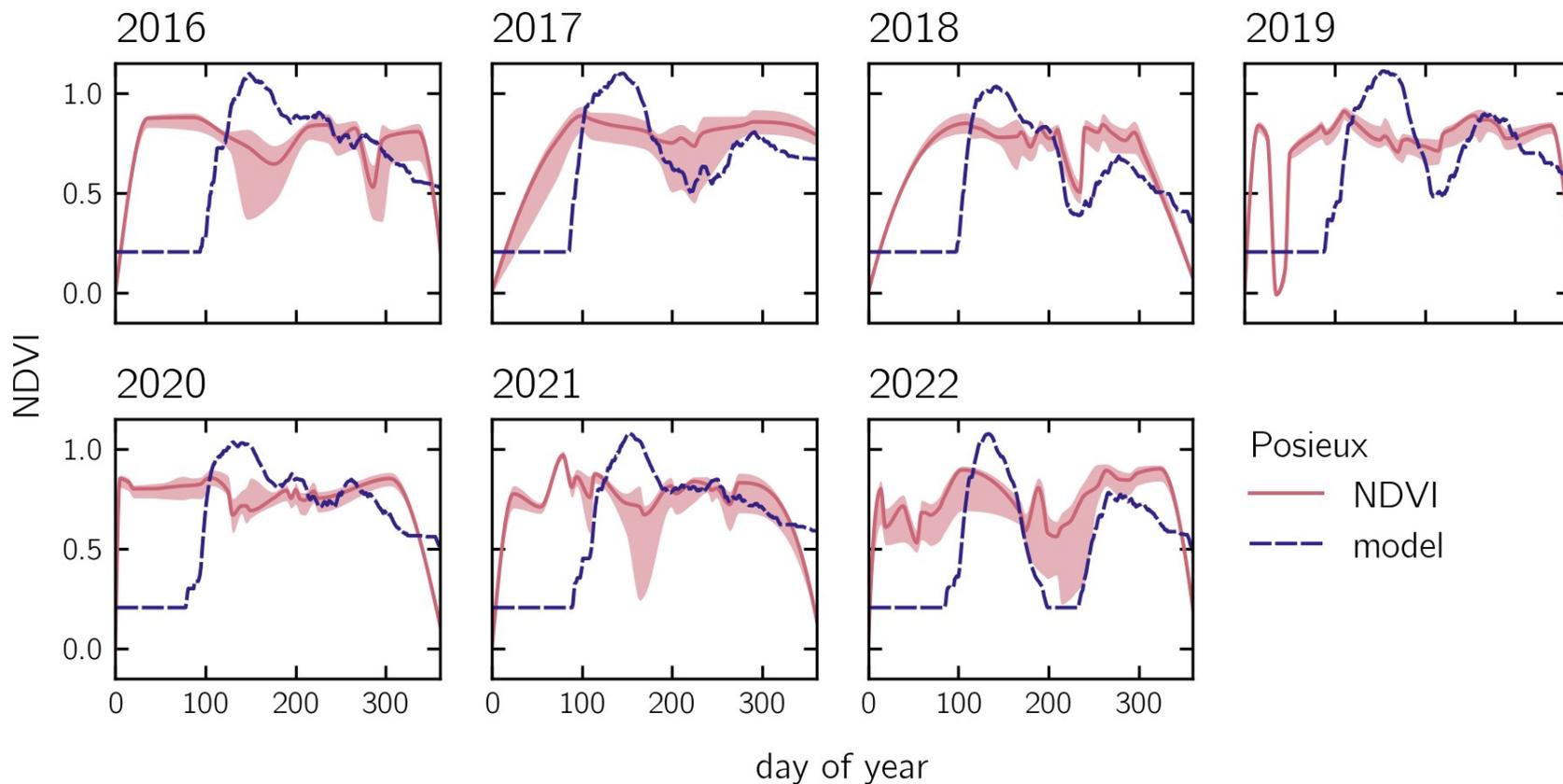


→ Clear correlations for important features.

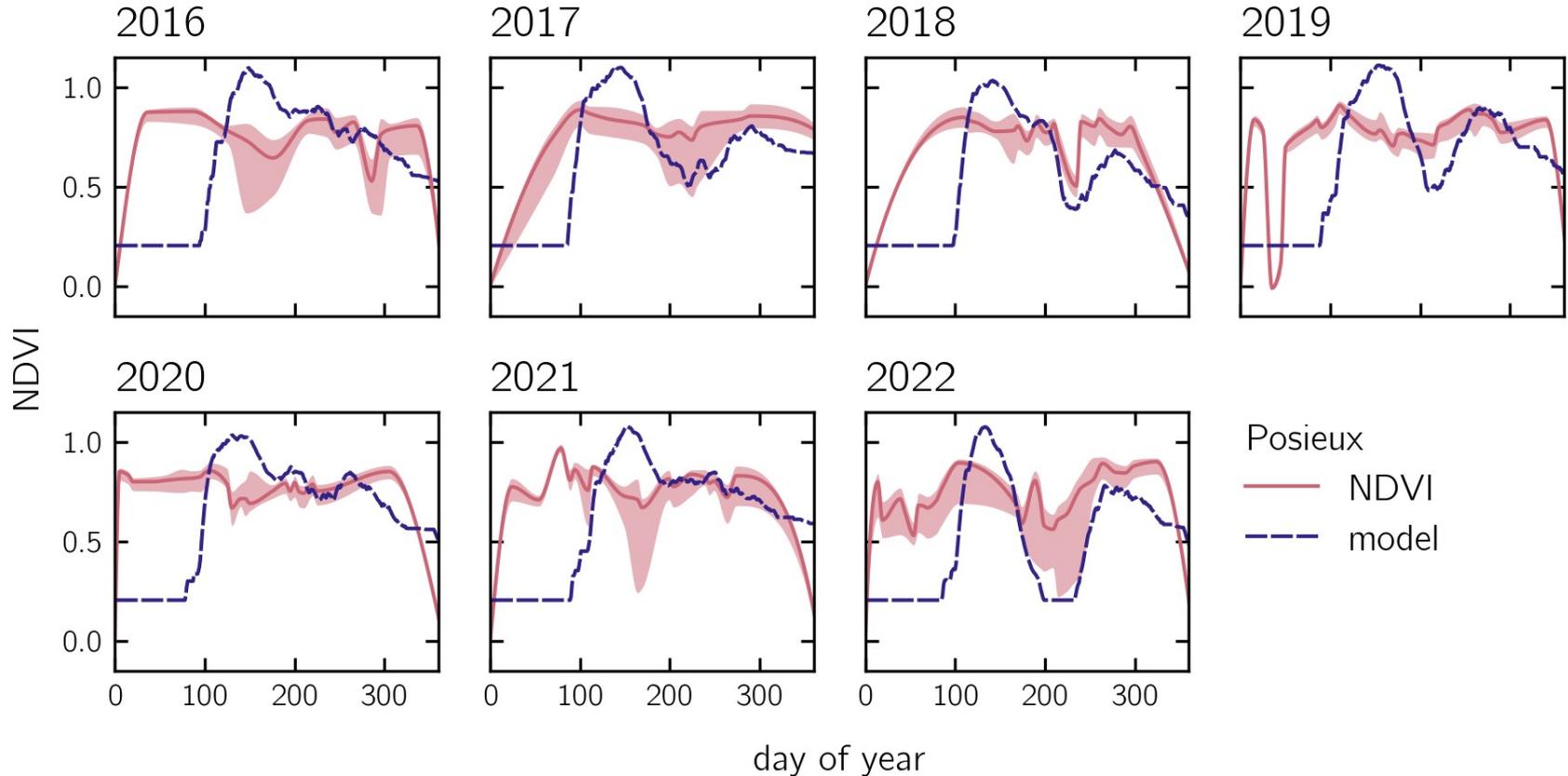
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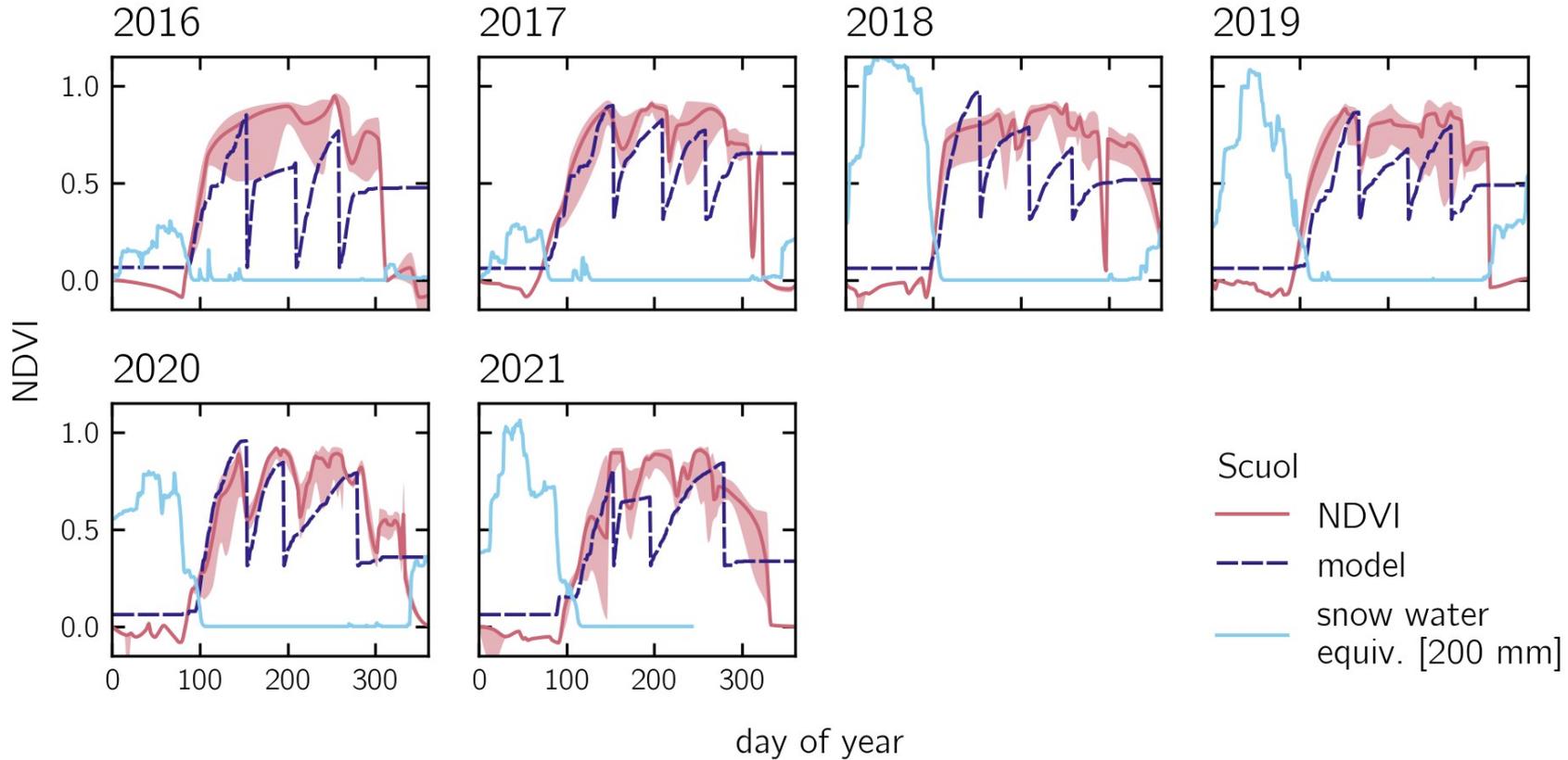
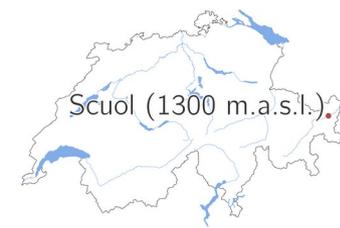


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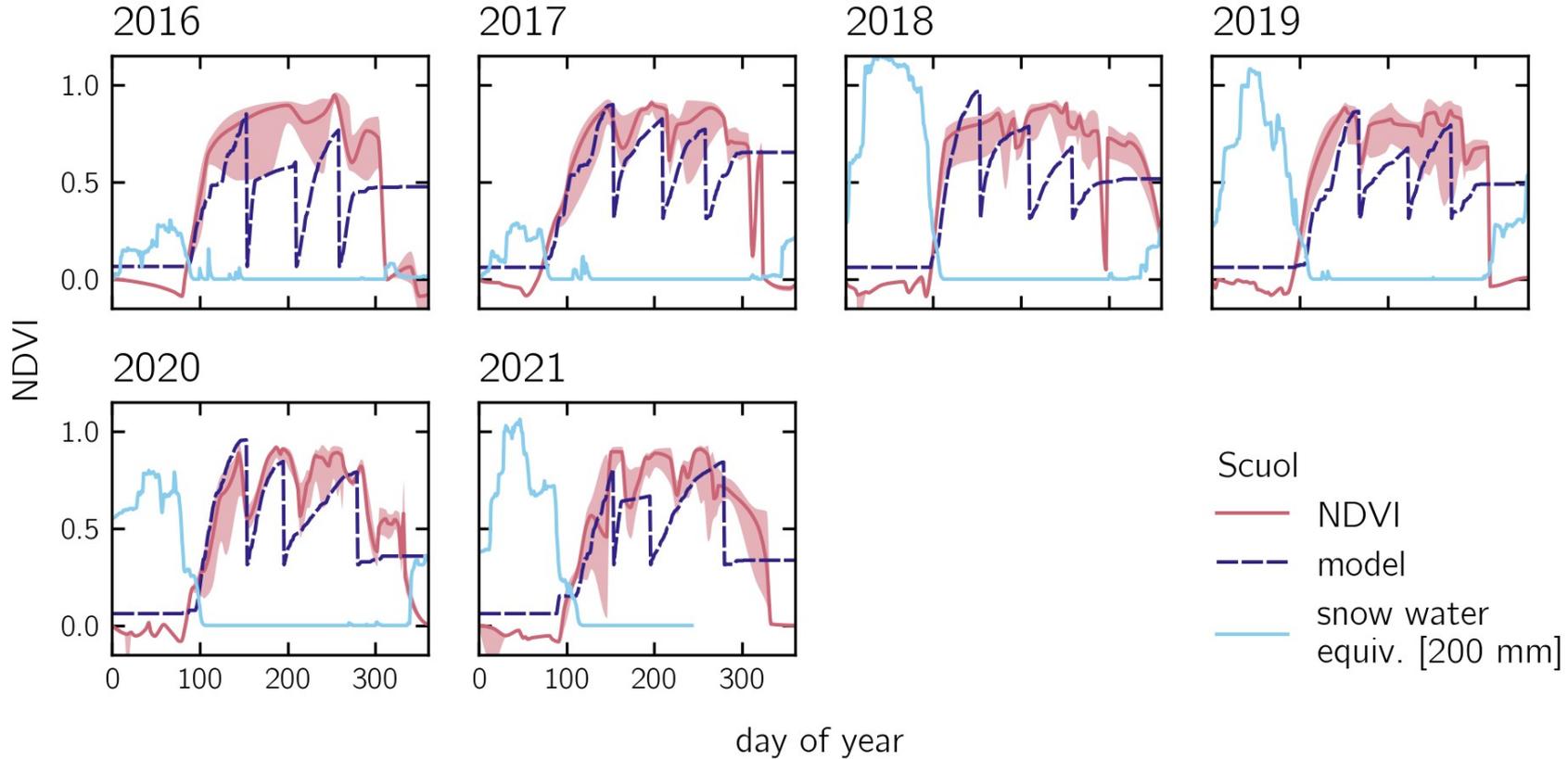


→ Start of growing season not captured at all by NDVI in lowlands.

# Discussion: Snow – Alpine Site

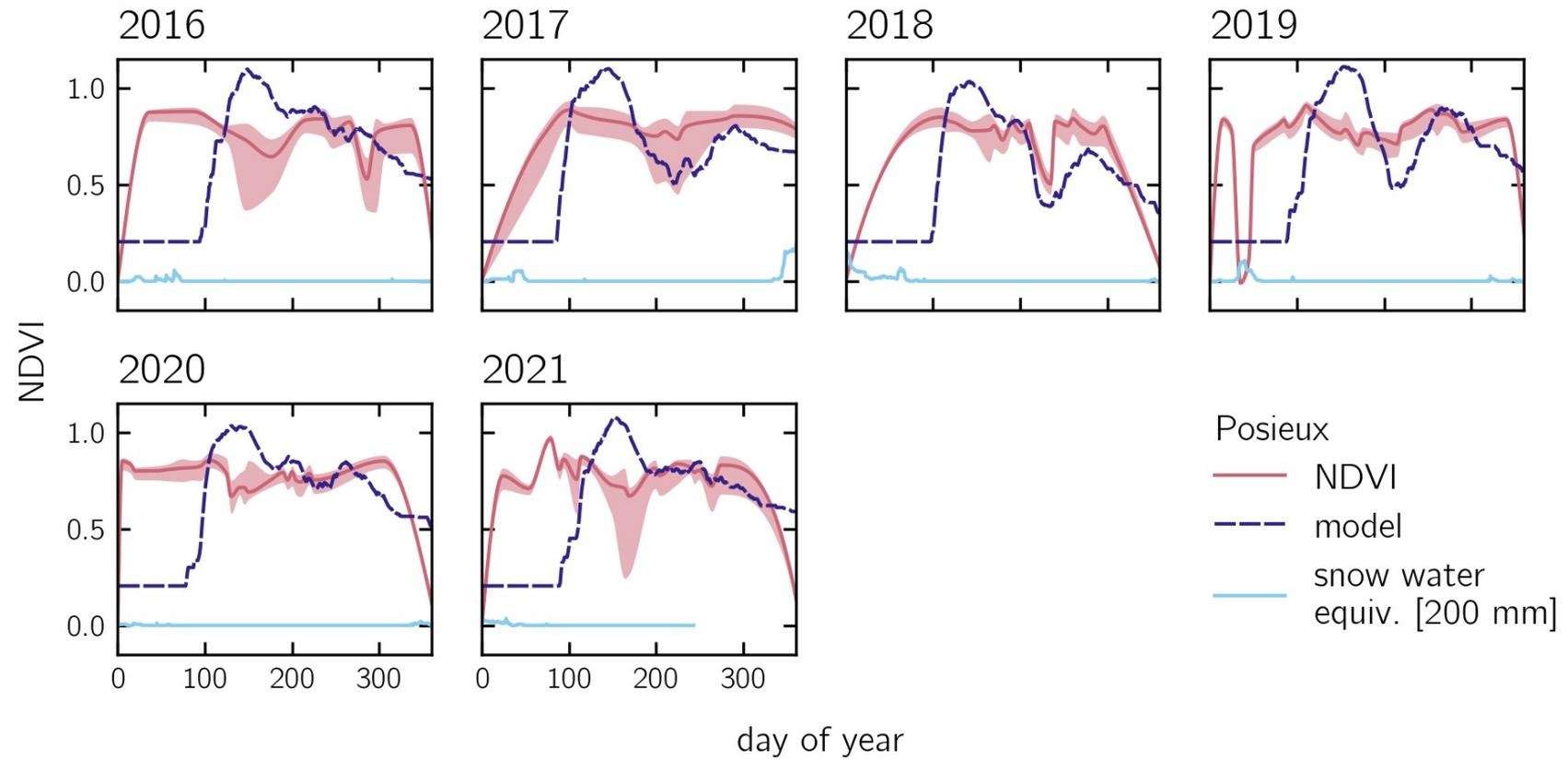


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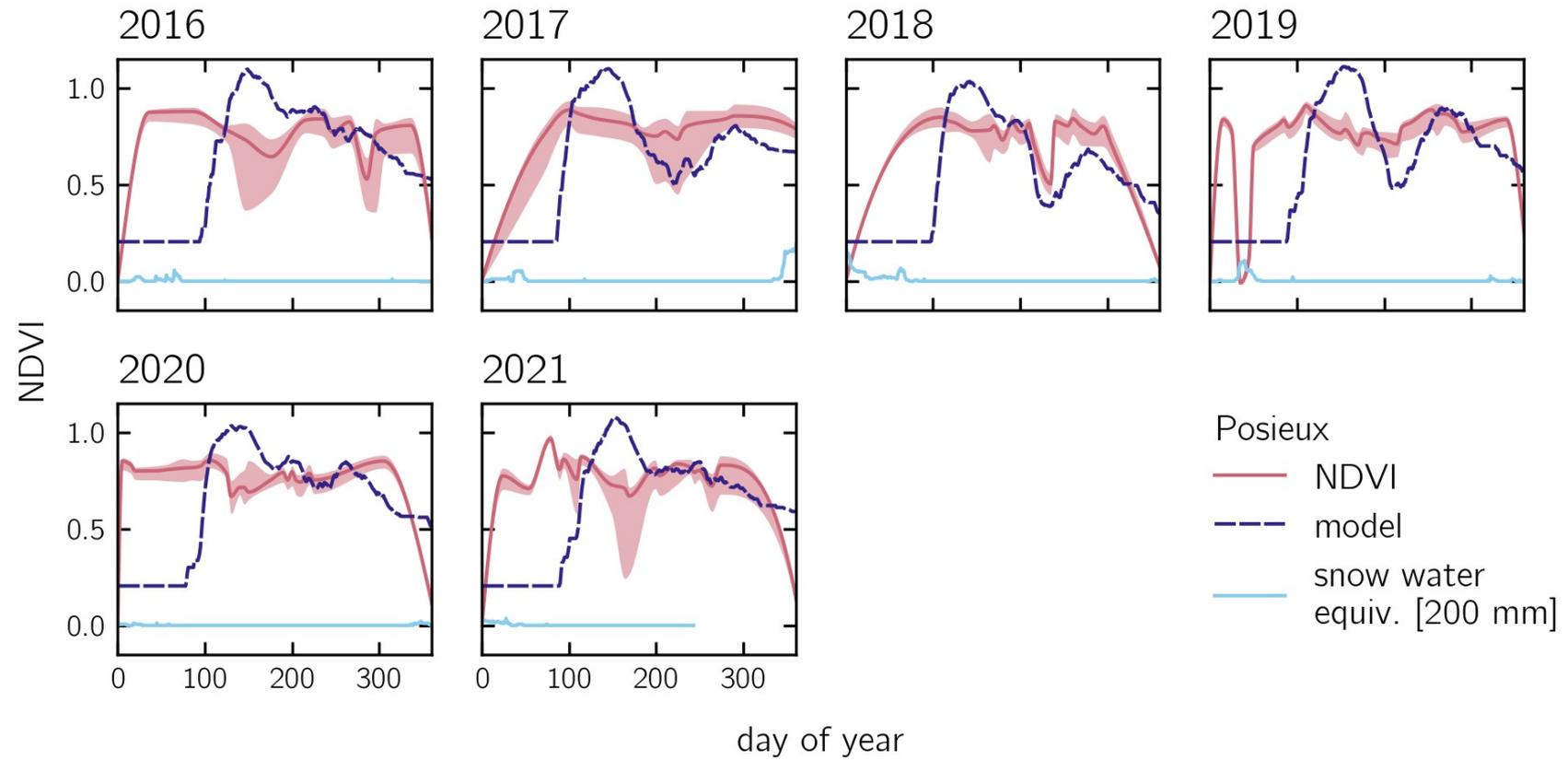


→ NDVI is highly sensitive to snow.

# Discussion: Snow – Lowland Site



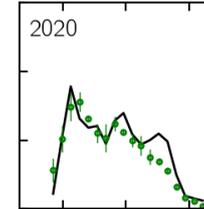
# Discussion: Snow – Lowland Site



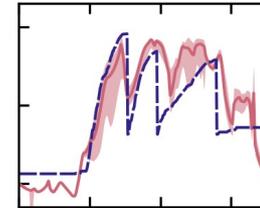
→ In lowlands, without snow, grass already looks green in January.

# Summary

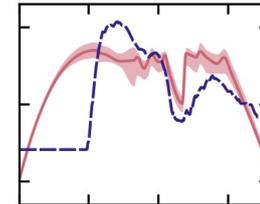
- Grass growth model reliably predicts dynamics.



- Strong agreement between model and NDVI in Alpine region.



- Start of growing season not captured by NDVI in lowlands.



# Outlook

- Circumvent small scale of Swiss agriculture by aggregating over multiple grassland areas in a region.
- Go beyond simple indices (NDVI, EVI) and use all Sentinel-2 bands.
  - Radiative Transfer Models, other ML approaches
- Account for seasonal dependency in the LAI → VI correspondence function.

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Poster by  
Sélène Ledain  
Thursday!  
**X1.106**

# Acknowledgements



Helge  
Aasen



Fabio  
Oriani



Manuel  
Schneider



Daria  
Larcher



Sélène  
Ledain



Pierluigi  
Calanca

# Acknowledgements



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Schneider

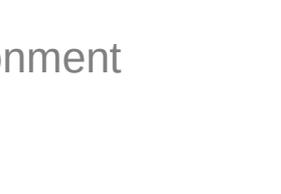
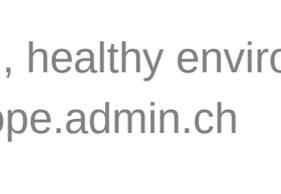
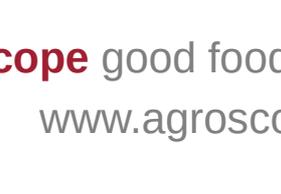
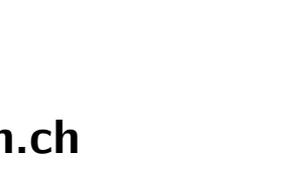
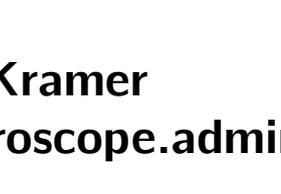
Daria  
Larcher

Sélène  
Ledain

Pierluigi  
Calanca

Poster  
today!  
**X1.56**

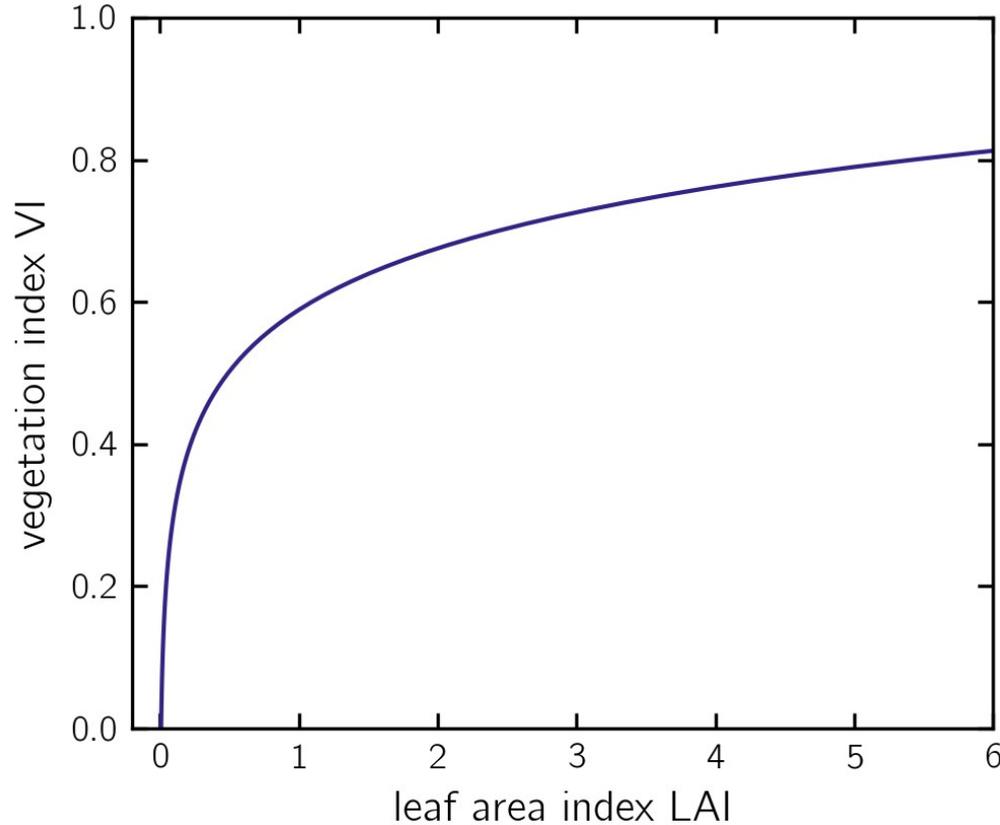
Poster  
Thursday!  
**X1.106**



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**Agroscope** good food, healthy environment  
 www.agroscope.admin.ch

# Transformation between modelled LAI to NDVI



$$LAI = s \cdot e^{\lambda \cdot VI}$$

$$s = 0.009$$

$$\lambda = 8$$

# Scale of Swiss Agriculture (Posieux)

1 km



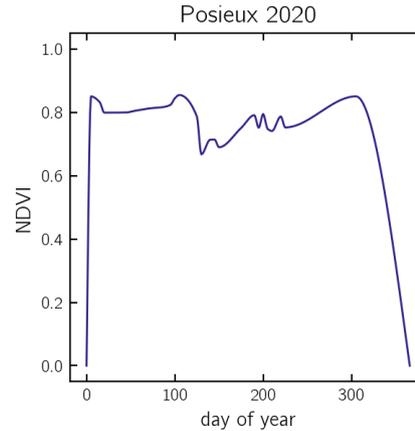
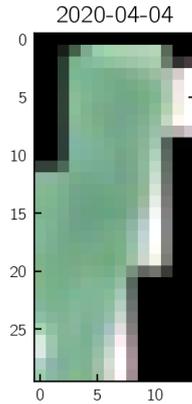
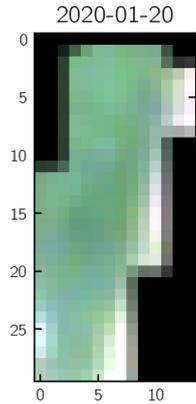
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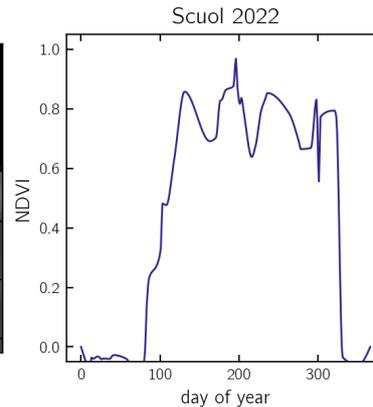
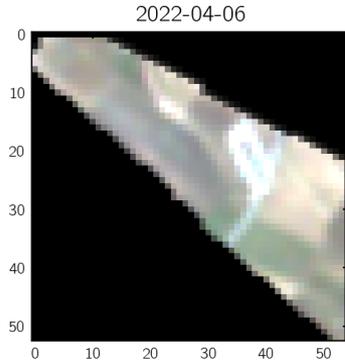
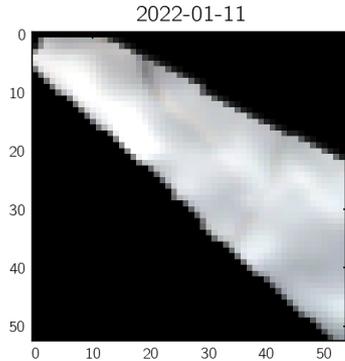
1 km



# VIS Satellite Images



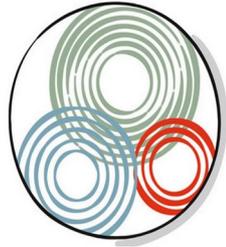
Just by eye, Posieux appears as green in January as it does in April



Meanwhile, Scuol is white (snow cover) in January.

# Context: National Center for Climate Services (NCCS)

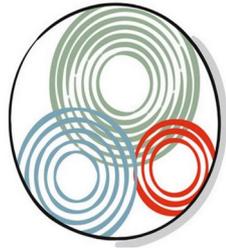
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## NCCS Impacts

trans-sectoral knowledge basis  
for decision making

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## NCCS Impacts

trans-sectoral knowledge basis  
for decision making

Critical  
Infrastructure



Ecosystem  
Services (ESS)



Health



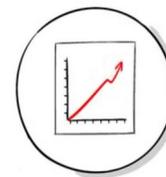
Costs of CC



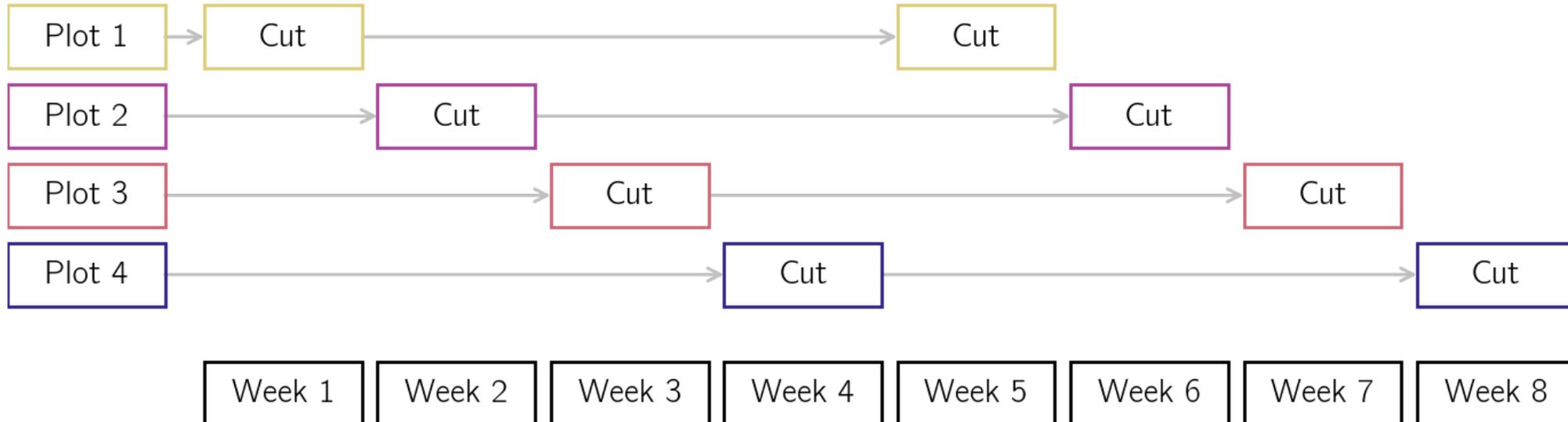
Supply  
Chains



Socioeconomic  
Pathways



# Validation Data: Measurement Procedure



# Switzerland Is a *Grass Land*

