

# Detecting spatial patterns of change in vegetation condition inside Bavarian Forest National Park using Multi- and Hyperspectral spaceborne datasets

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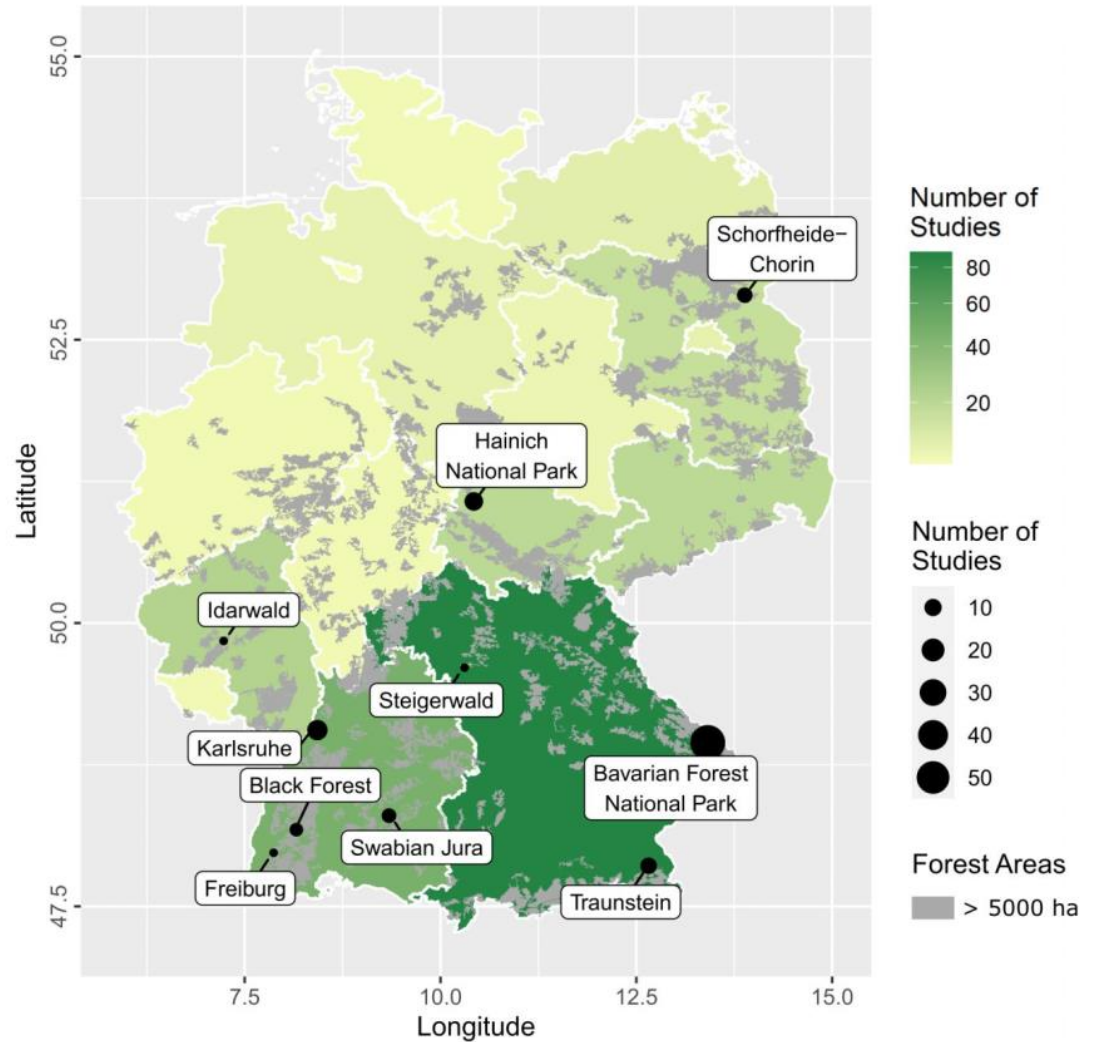
<sup>3</sup> Bavarian Forest National Park



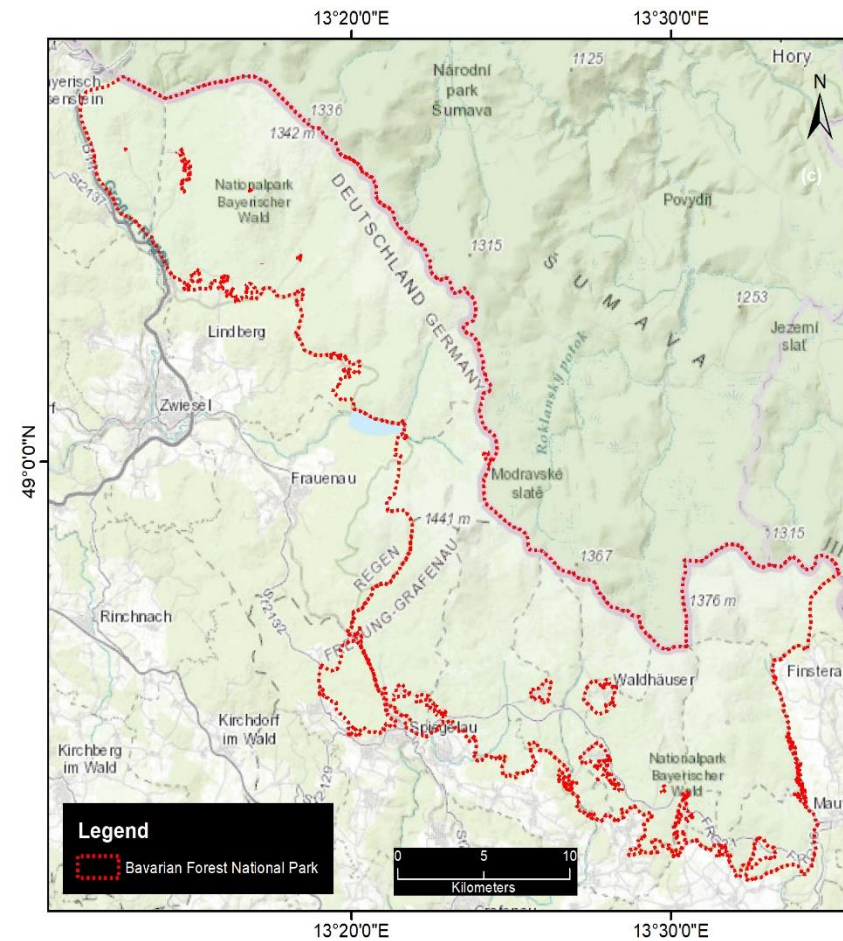
Knowledge for Tomorrow



# Study Site: Bavarian Forest National Park (BFNP)



(S. Holzwarth et al., 2020)



- Heterogeneous mountainous forest
- Norway spruce dominant species
- 24,250 ha
- established 1970



# DLR Earth Sensing Imaging Spectrometer (DEISIS) Mission

- Operated by DLR (scientific) and Teledyne Brown Engineering (commercial)
- Installed on the International Space Station (ISS)
- Target lifetime from 2018 – 2023
- Average revisit frequency of 3 – 5 days, BUT no mapping mission



Parameter	Value
Spectral coverage	402 nm – 1000 nm
Spectral sampling	2.55 nm (w/o binning) ~ <b>10.2 nm (binning 4)</b>
Ground sampling distance (GSD) at nadir	~ 30 m (depends on the flight altitude of the ISS)
Swath at nadir	~ 30 km (depends on the flight altitude of the ISS)

(K. Alonso et al., 2019)

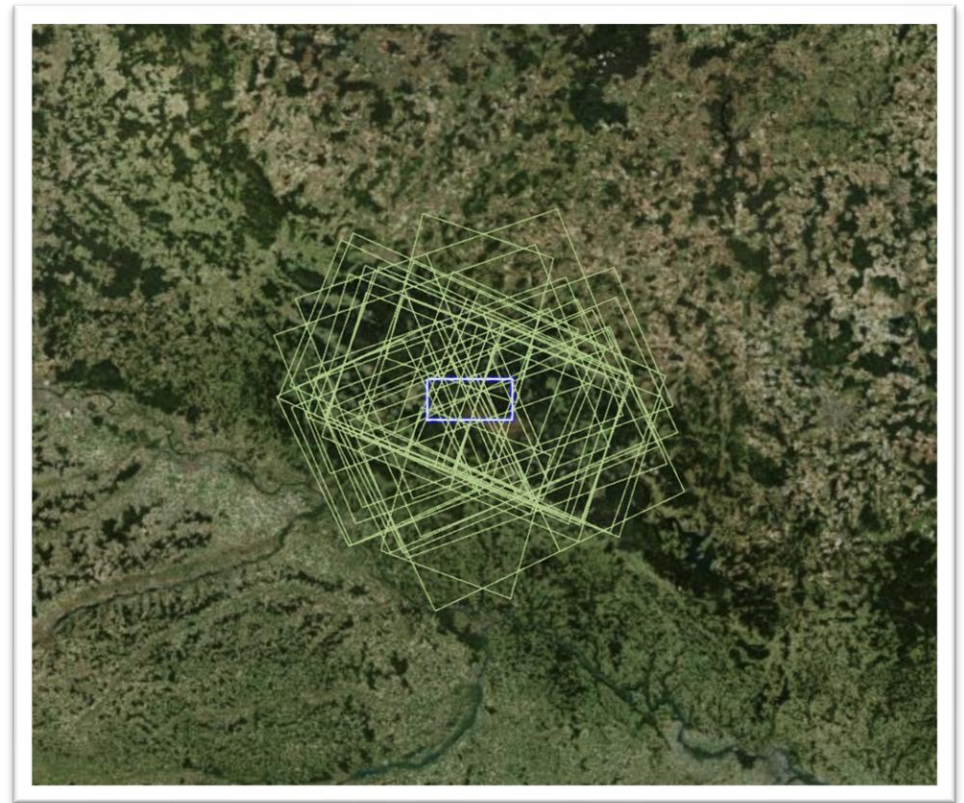


# DESIS Data of the BFNP

Search Results

Products Coverage Areas

				Name	Acquisition Date	Cloud Coverage Per	Acquisition Time	Quality Rating
<input type="checkbox"/>				DESIS-HSI-20190611T	6/11/2019	From 50 to 75	15:32:56 GMT	Acceptable
<input type="checkbox"/>				DESIS-HSI-20190611T	6/11/2019	From 75 to 100	15:33:01 GMT	Acceptable
<input type="checkbox"/>				DESIS-HSI-20190612T	6/12/2019	From 0 to 25	11:29:42 GMT	Acceptable
<input type="checkbox"/>				DESIS-HSI-20190612T	6/12/2019	Clear	11:29:47 GMT	Acceptable
<input type="checkbox"/>				DESIS-HSI-20190618T	6/18/2019	From 50 to 75	12:59:32 GMT	Acceptable
<input type="checkbox"/>				DESIS-HSI-20190618T	6/18/2019	From 25 to 50	12:59:37 GMT	Acceptable
<input type="checkbox"/>				DESIS-HSI-20190623T	6/23/2019	From 75 to 100	07:15:04 GMT	Acceptable
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<input type="checkbox"/>				DESIS-HSI-20191027T	10/27/2019	From 25 to 50	08:53:24 GMT	Acceptable
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<input type="checkbox"/>				DESIS-HSI-20200422T	4/22/2020	Clear	10:35:05 GMT	Acceptable
<input type="checkbox"/>				DESIS-HSI-20200422T	4/22/2020	Clear	10:35:10 GMT	Acceptable
<input type="checkbox"/>				DESIS-HSI-20200612T	6/12/2020	From 25 to 50	10:53:58 GMT	Acceptable
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<input type="checkbox"/>				DESIS-HSI-20200623T	6/23/2020	From 50 to 75	10:11:49 GMT	Acceptable
<input type="checkbox"/>				DESIS-HSI-20200624T	6/24/2020	From 0 to 25	06:09:58 GMT	Acceptable



- 40 acquisitions from June 2019 – October 2021
- 12 data takes with clear condition (incl. no haze and no contrails)
- 8 scenes with solar zenith angles < 50 degree
- 6 tiles without snow
- 2 dates with full coverage: **29.06.19 & 17.06.21**  
=> leaf-on season



# Observed Weather Extremes in the BFNP 2019-2021

2019:

- the third hottest year
- 350 millimeters less precipitation than average

2020:

- second lowest number of days with snow
- lowest number of days with sub-zero temperatures

2021

- 20°C mark was exceeded in March for the first time

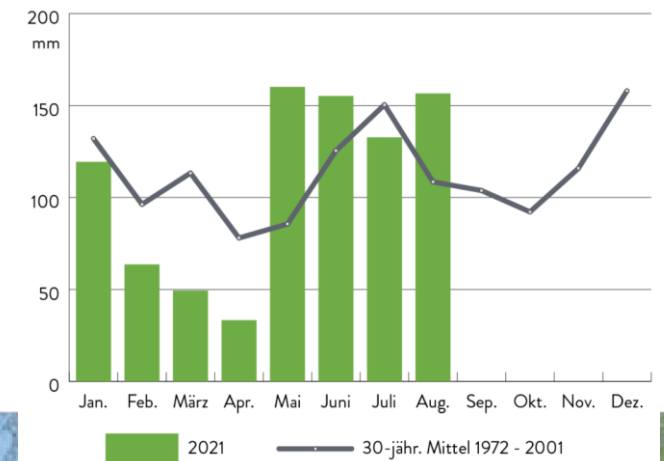
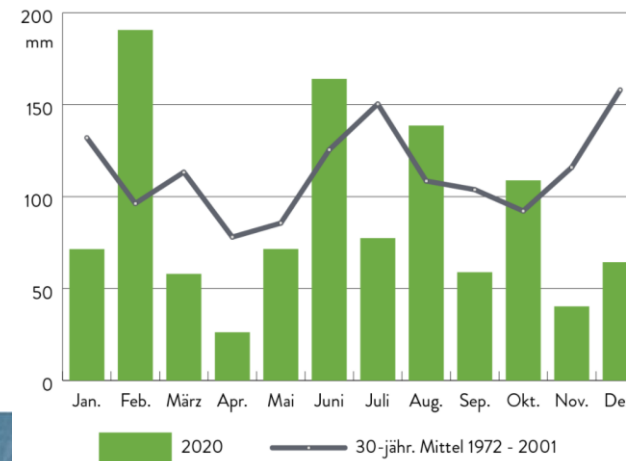
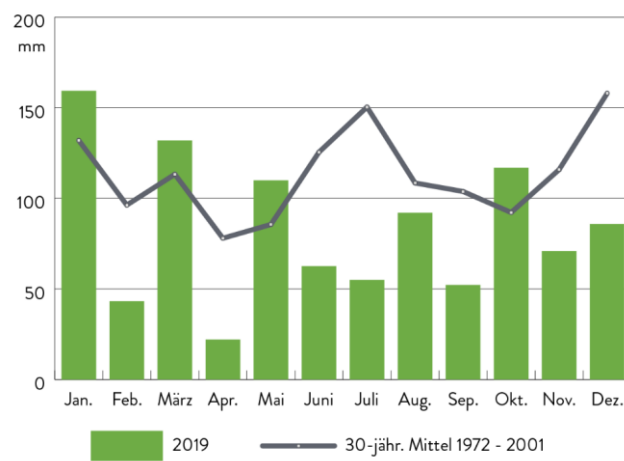
Effects on the National Park

→ increased emergence of bark beetle

→ infestation of native spruce trees

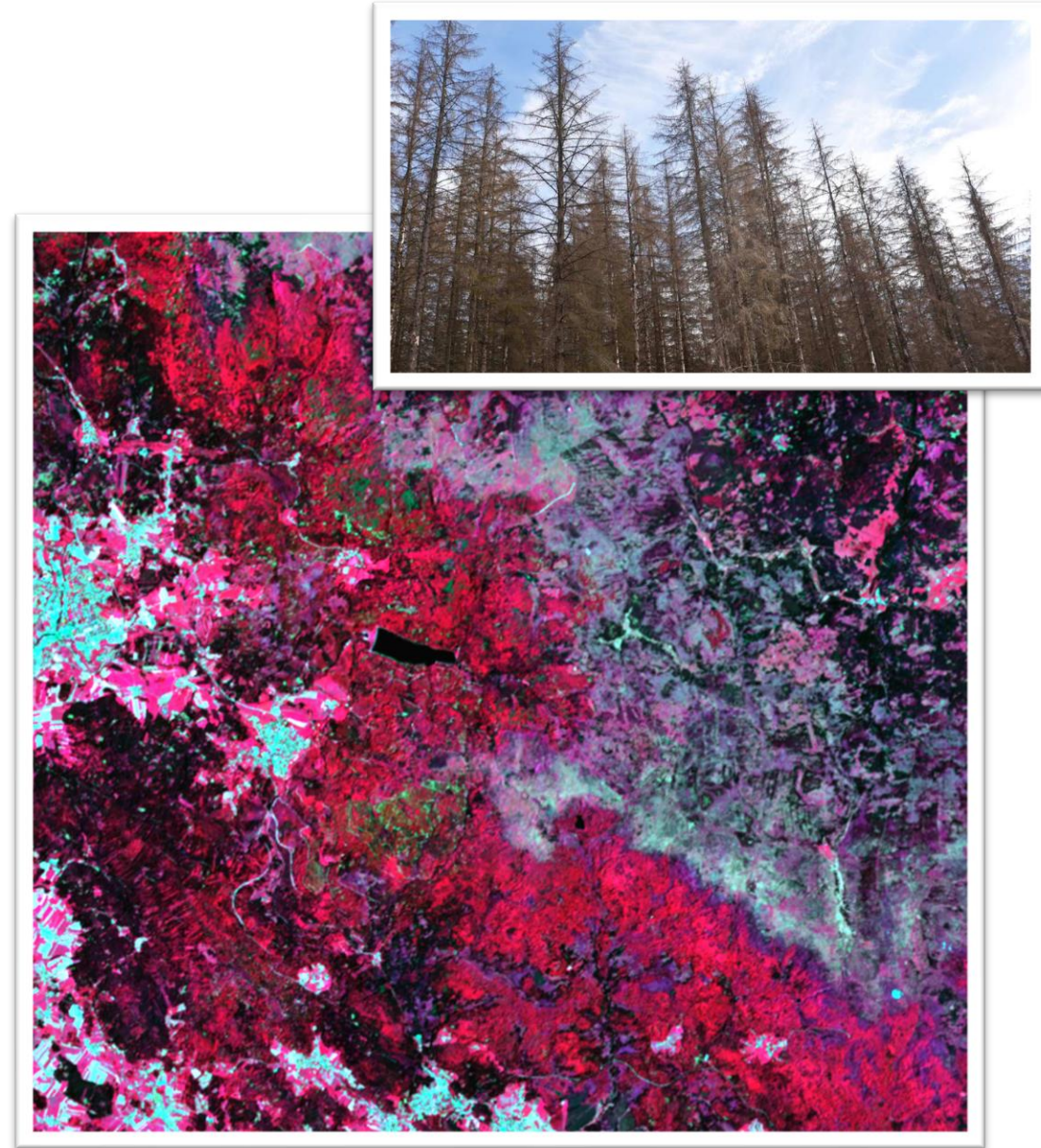
→ beech trees still cope with climate change

Monthly precipitation in BFNP (Jan 2019 – Aug 2021)



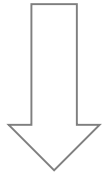
# Research Questions

- How can DESIS data be used to observe changes in vegetation status over time?
- Which spectral index is most suitable to detect bark beetle infested trees in the National Park?
- Do the results add value compared to results obtained with Sentinel-2 data?
- Does the combination of DESIS and Sentinel-2 improve the accuracy of detected changes?



# Supporting Data from the National Park

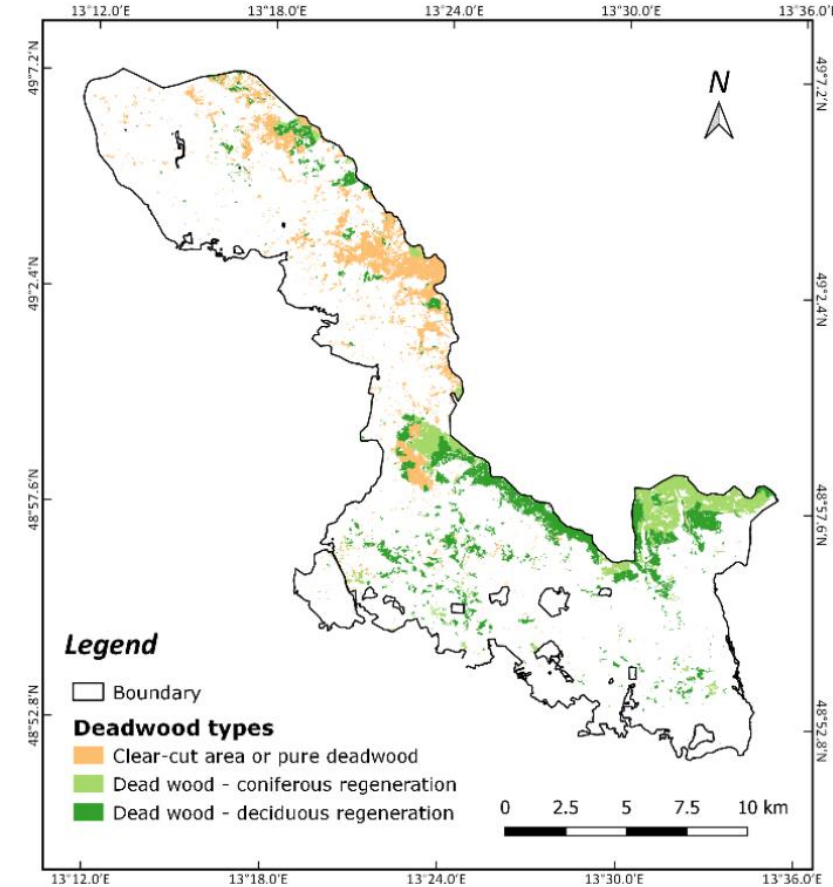
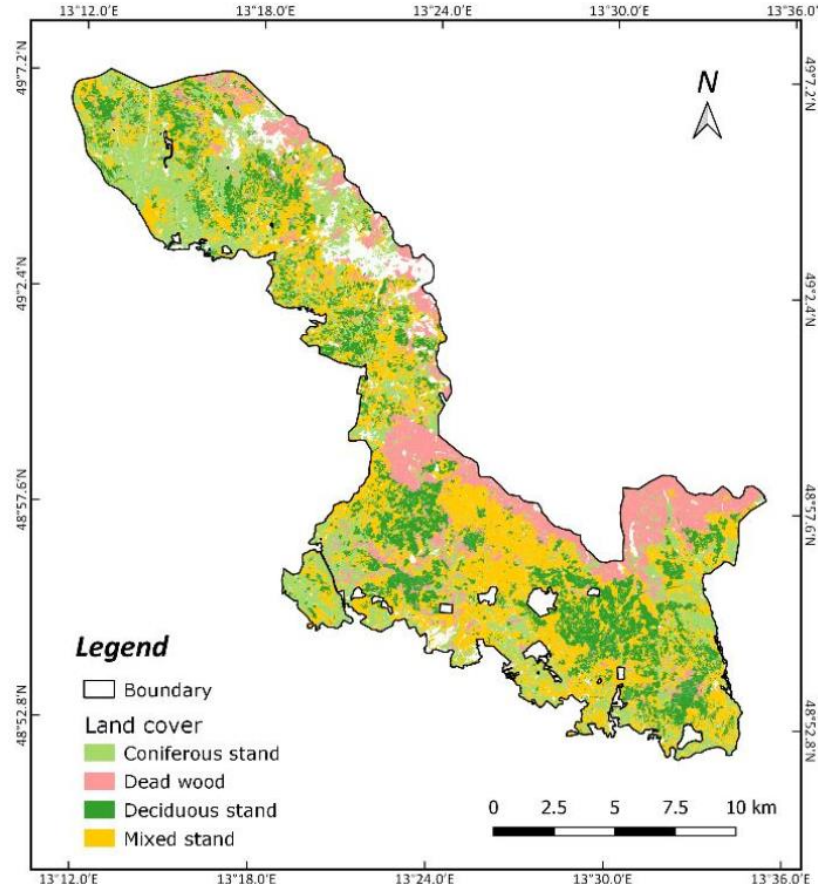
- Information on forest type
- Information on deadwood types
- Information on infestation year



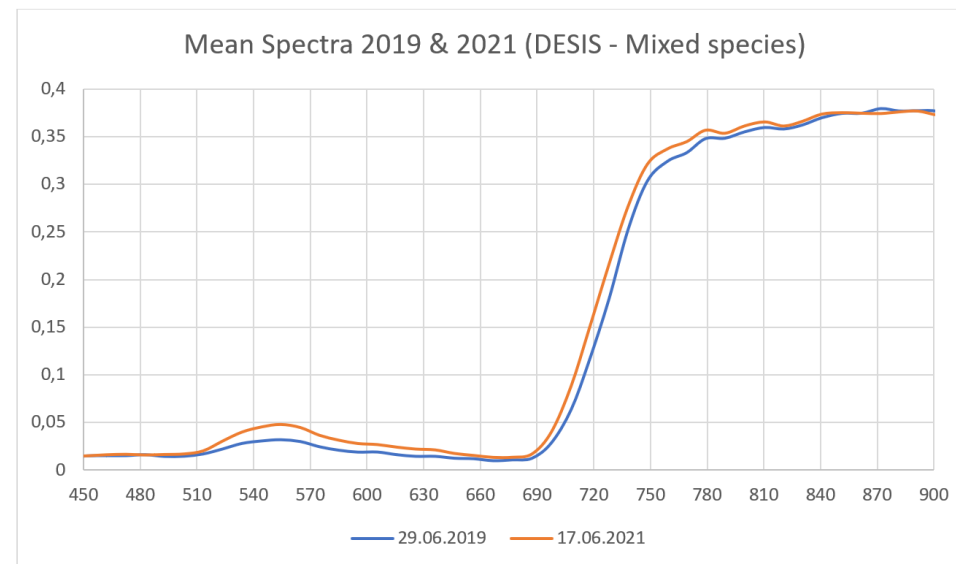
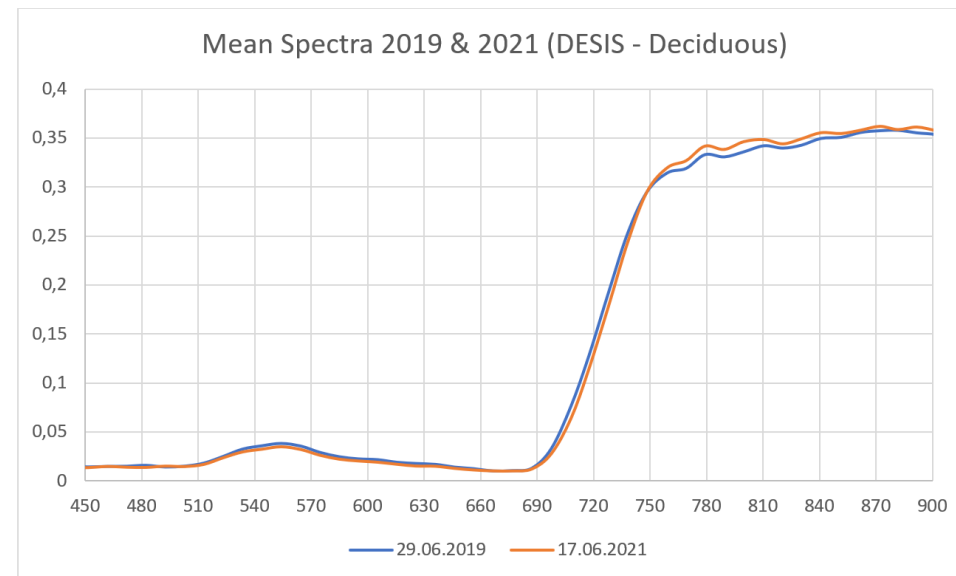
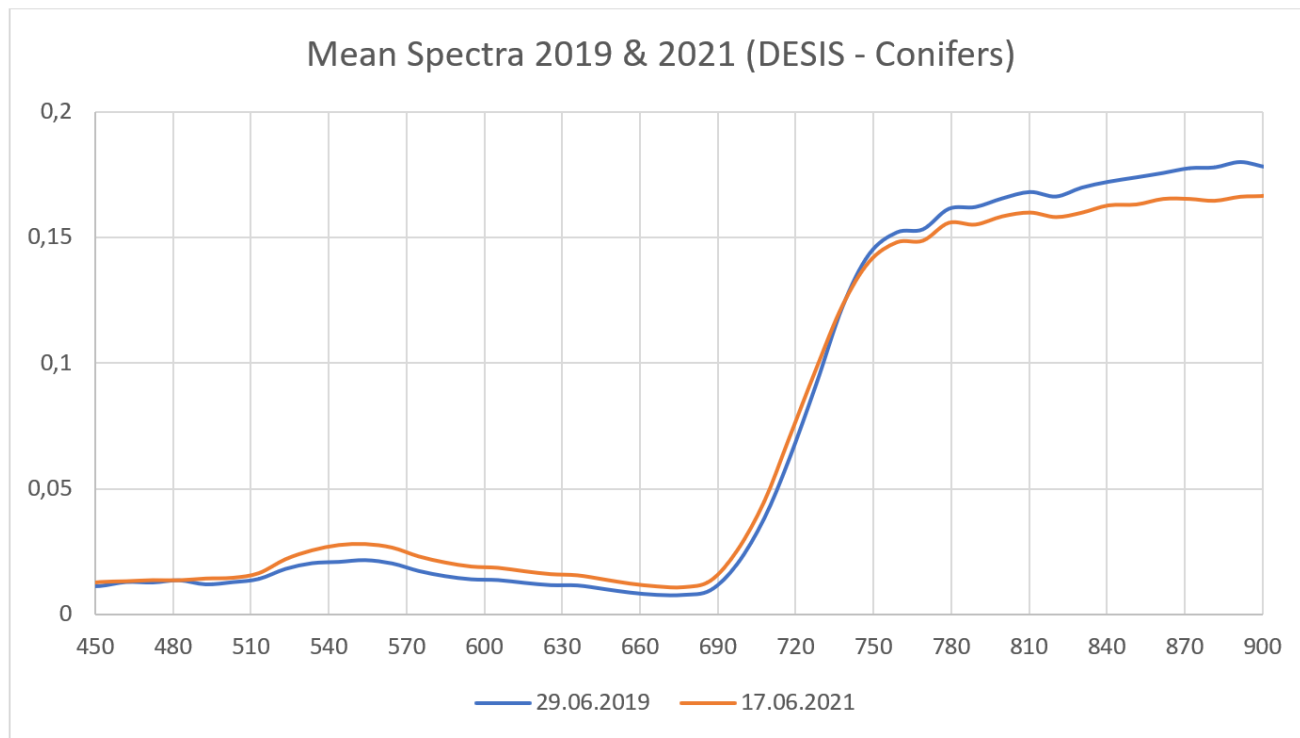
Concentrate analysis on coniferous areas

- ✓ Evergreen
- ✓ Less pronounced seasonal changes
- ✓ Link to bark beetle infestation

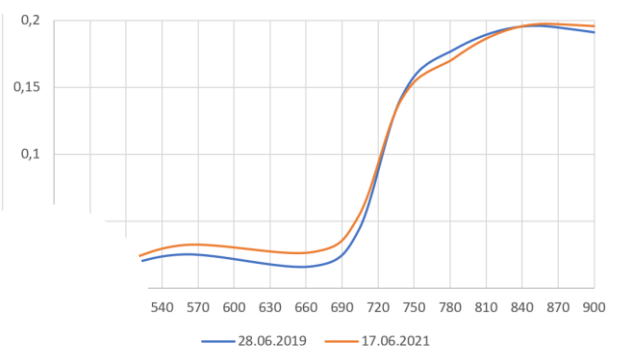
Validation data of the years 2020 and 2021



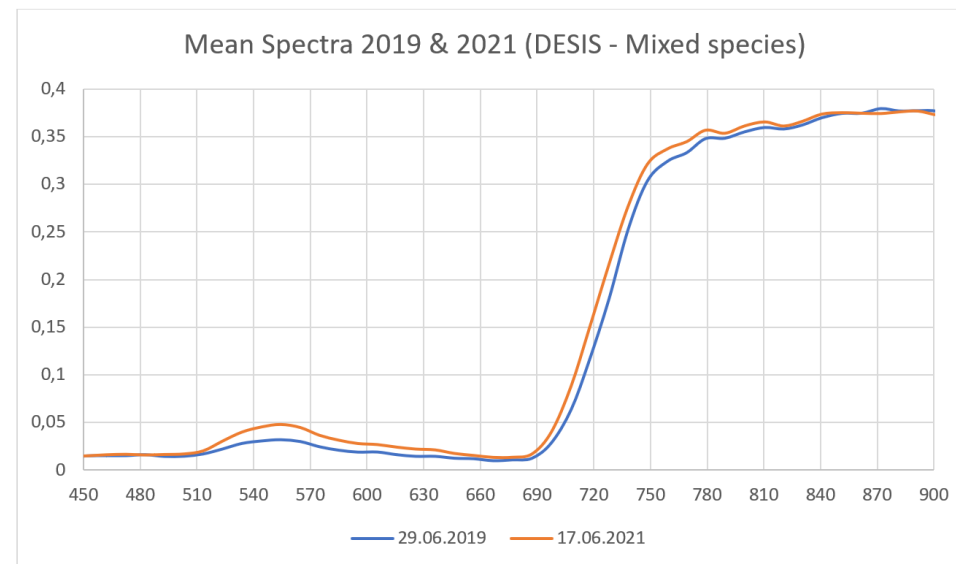
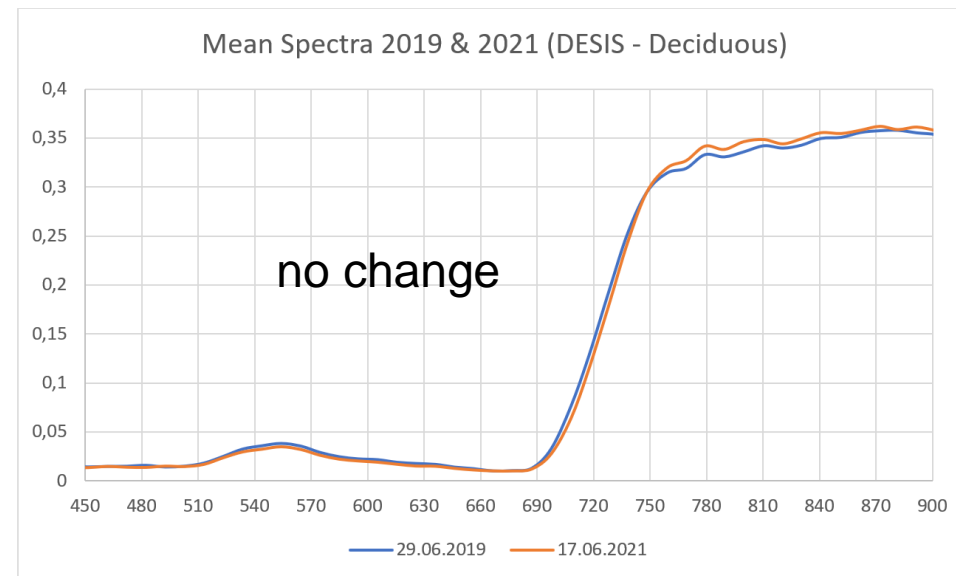
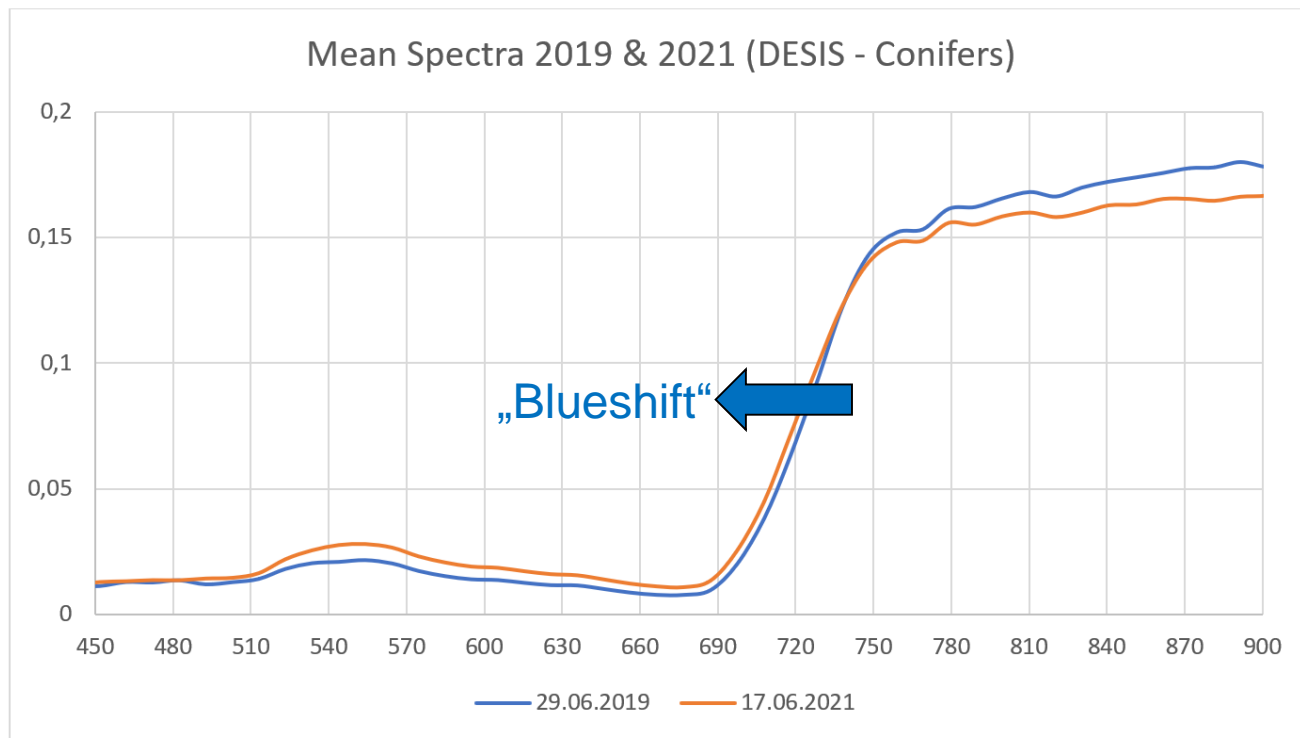
# Spectral Changes 2019-2021



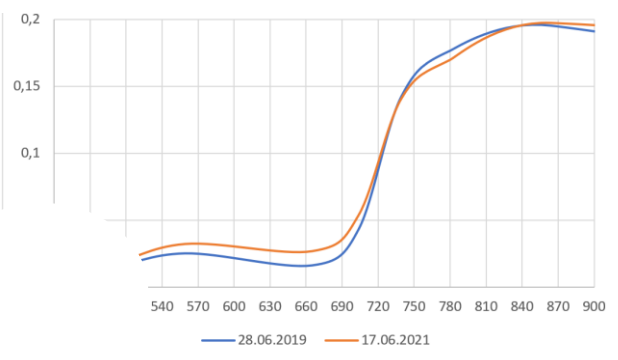
Mean Spectra 2019&2021 (S2 - Conifers)



# Spectral Changes 2019-2021



Mean Spectra 2019&2021 (S2 - Conifers)



# Spectral Indices Selection

## Structural

- Normalized Difference Vegetation Index (NDVI) – **D & S2**
- Green Normalized Difference Vegetation Index (GNDVI) - **S2**
- Specific Leaf Area Vegetation Index (SLAVI) – **S2**

## Chlorophyll & RedEdge

- Normalized Difference Red Edge Index (NDRE) - **D & S2**
- Photochemical Reflectance Index (PRI) - **D**
- Modified Chlorophyll Absorption Ratio Index (MCARI) - **D**
- Modified Red Edge Simple Ratio (MRESR) - **D**
- Vogelmann Red Edge Index 1 - **D**

## Other Leaf Pigments

- Visible Atmospherically Resistant Indices Green (VIGreen) - **D & S2**
- Carotenoid Reflectance Index 2 (CRI) – **D**
- Anthocyanin Reflectance Index (ARI) – **D**



# Spectral Indices Selection

## Structural

- Normalized Difference Vegetation Index (NDVI) – **D & S2**
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## Results: Structural

- Structural indices showed negligible differences
- Sensitive to background reflectance
- Difficult to interpret changes in conifers
- Potential for broadleaf canopy

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- Vogelmann Red Edge Index 1 - **D**



## Results: Chlorophyll & RedEdge

- Narrow band indices that incorporates red edge range strongly correspond to the affected infested/deadwood areas
- Especially MCARI performs well

## Other Leaf Pigments

- Visible Atmospherically Resistant Indices Green (VIGreen) - **D & S2**
- Carotenoid Reflectance Index 2 (CRI) – **D**
- Anthocyanin Reflectance Index (ARI) – **D**



## Results: Other Leaf Pigment

- Indices sparsely matched with the infested/dead regions
- Needle like leaves of conifers shows minimal variation



# Spectral Indices Selection

Evaluation of DESIS derived indices  
→ potential for mapping barkbeetle infested areas

## Structural

- Normalized Difference Vegetation Index (NDVI) – **D & S2**
- Green Normalized Difference Vegetation Index (GNDVI) - **S2**
- Specific Leaf Area Vegetation Index (SLAVI) - **S2**

## Results: Structural

- Structural indices showed negligible differences
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## Chlorophyll & RedEdge

- Normalized Difference Red Edge Index (NDRE) - **D**
- Photochemical Reflectance Index (PRI) - **D**
- Modified Chlorophyll Absorption Ratio Index (MCARI) - **D**
- Modified Red Edge Simple Ratio (MRESR) - **D**
- Vogelmann Red Edge Index 1 - **D**

Used for further investigation:

- MCARI (DESIS)
- Combined Vegetation Index CVI (S2) [Hill et al. 2019]

- Especially MCARI, CVI and NDRE incorporates red edge range strongly
- CVI and NDRE shows well infested/deadwood areas
- Especially MCARI, CVI and NDRE shows well

## Other Leaf Pigments

- Visible Atmospherically Resistant Indices Green (VIGreen) - **D & S2**
- Carotenoid Reflectance Index 2 (CRI) – **D**
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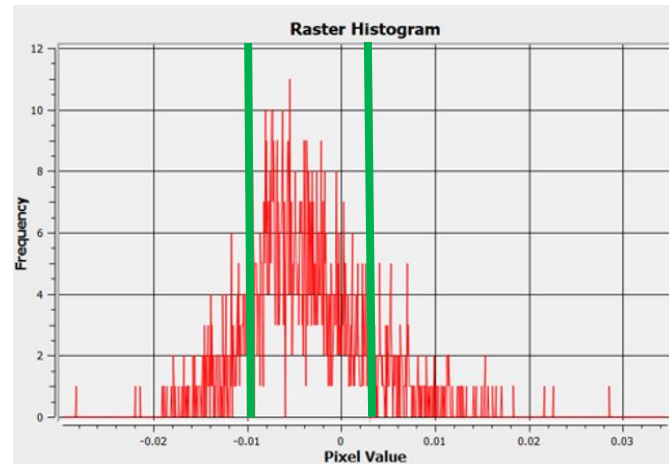
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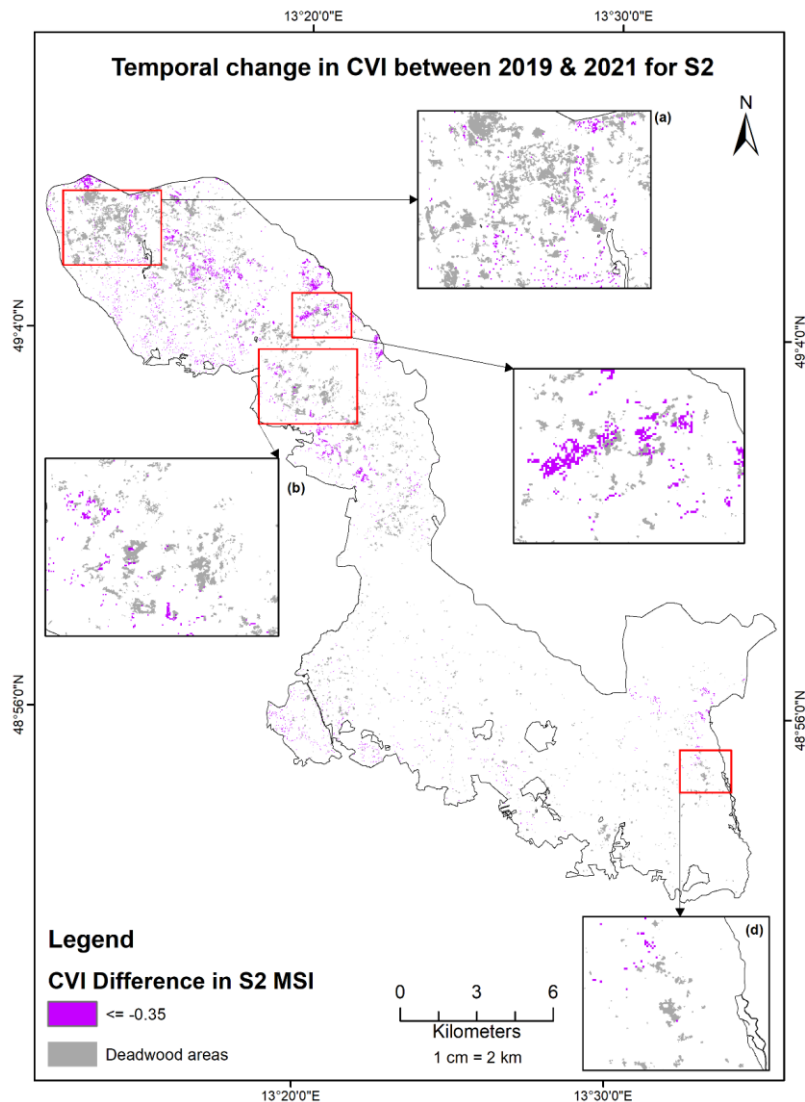


# Temporal Changes

Differences in index values for infested regions

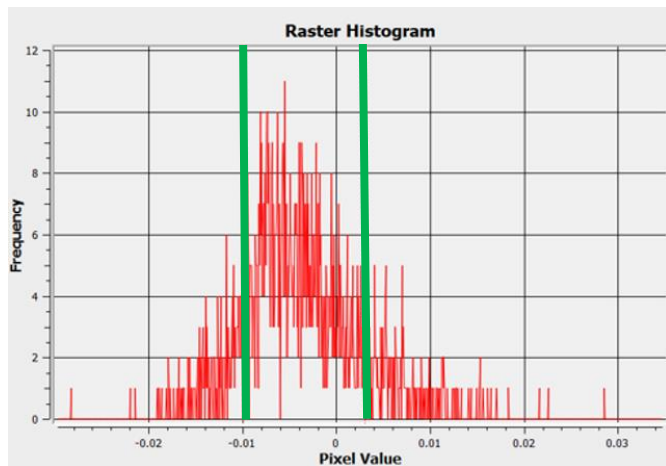


- interactive threshold selection
- aim: minimize false positives

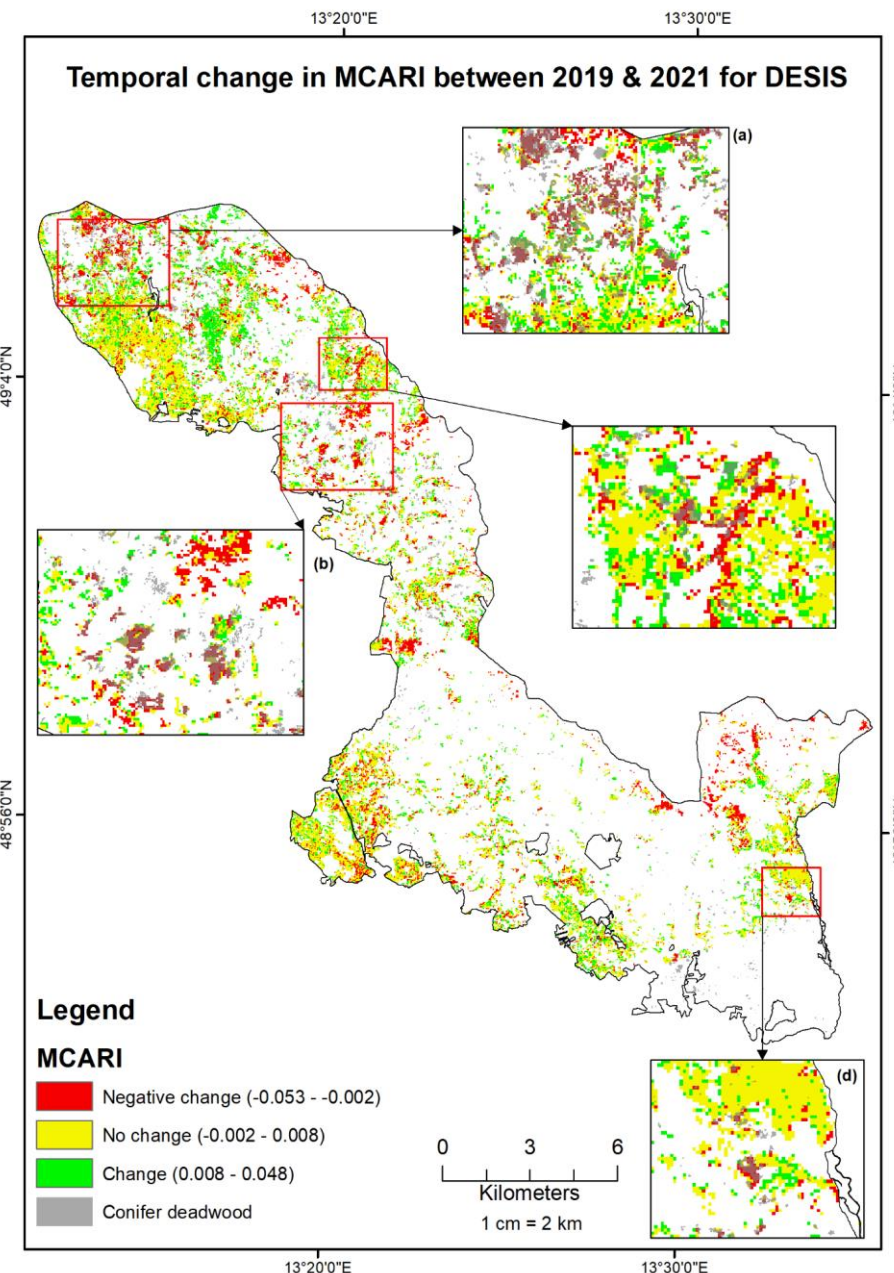
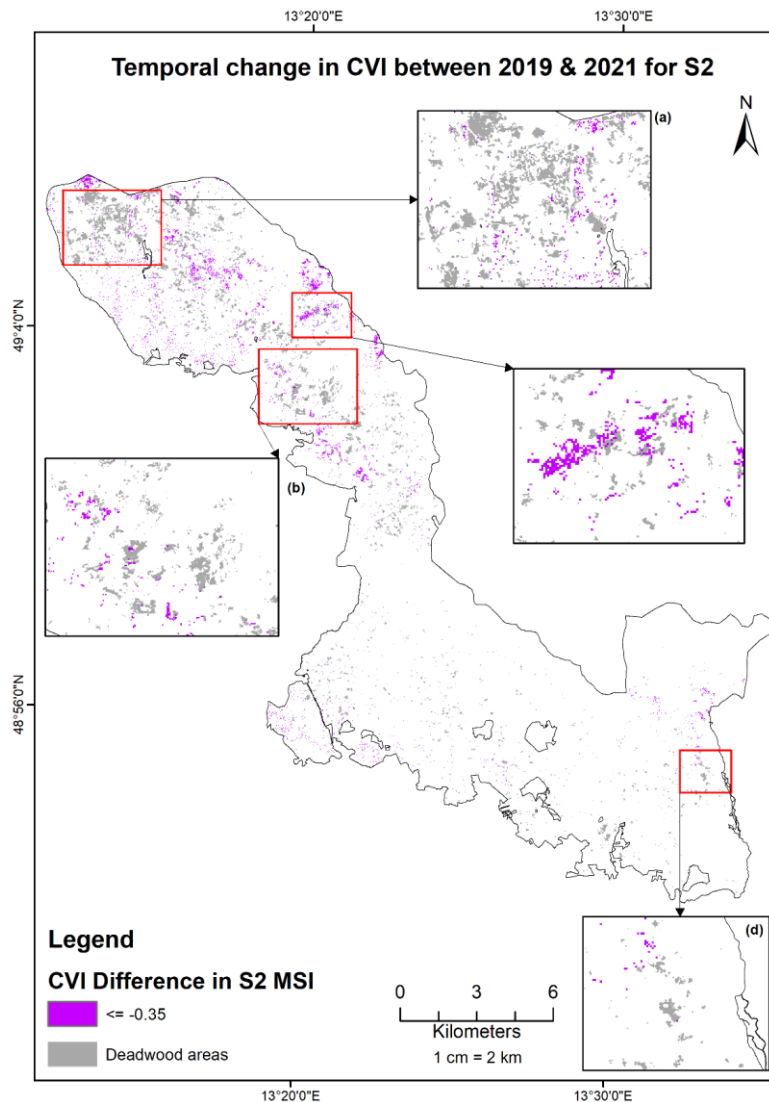


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Differences in index values for infested regions



- interactive threshold selection
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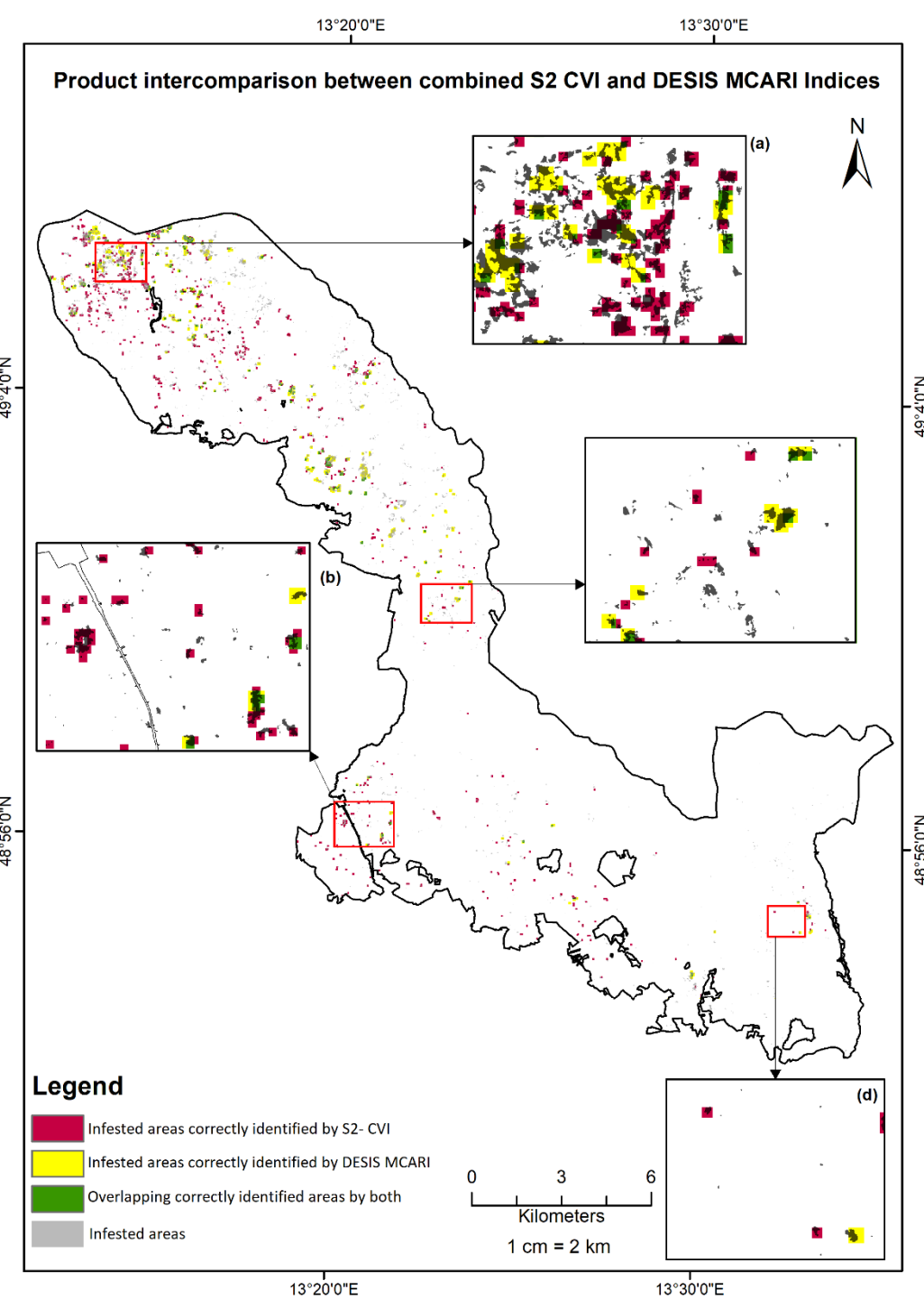


# Comparison / Combination of Results

- Matching pixel size to 30m and apply buffering to reduce geometrical mismatches
- Apply morphological operator „clump“ to cluster connectivity

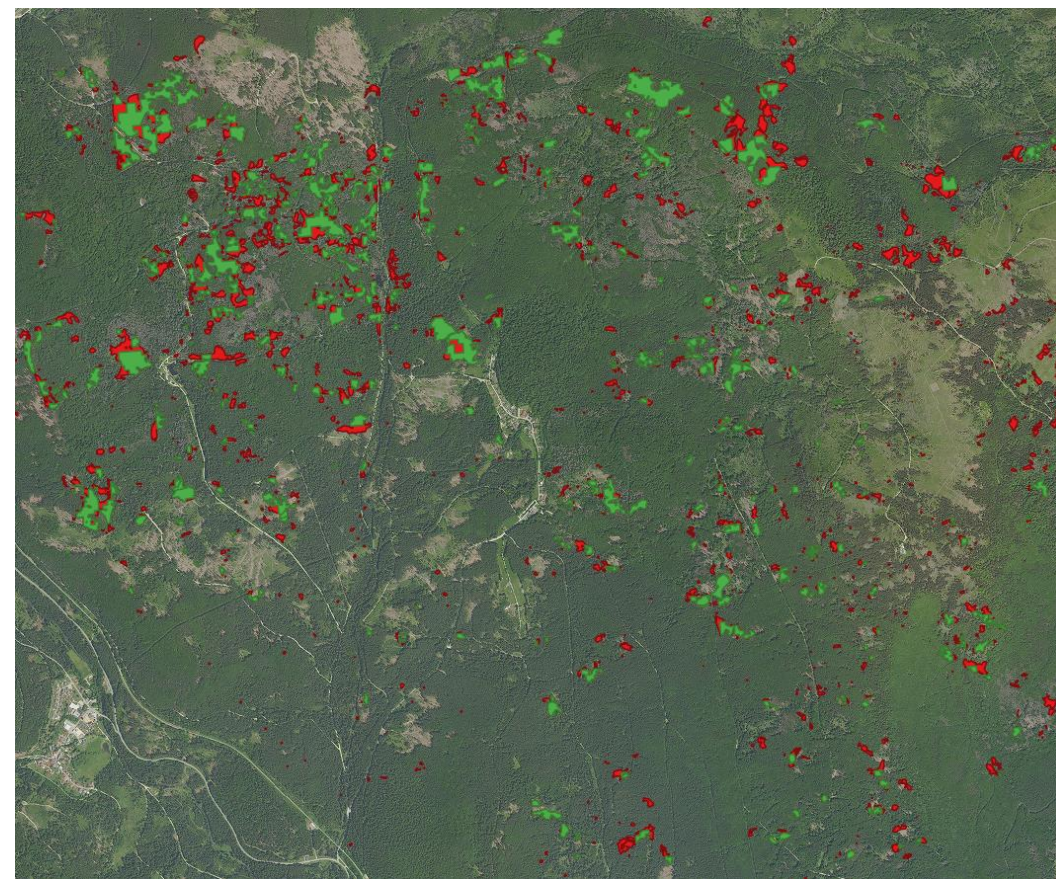
	Infested areas (number of polygons)	Number of correctly identified polygons
All infested areas	3365	1269 / 38%
Areas > 225 m <sup>2</sup>	1439	685 / 48%
Areas > 900 m <sup>2</sup>	707	900 / 57%
Areas > 2025 m <sup>2</sup>	350	208 / 59%

	Correctly identified (DESI)	Correctly identified (S2)	Correctly identified (DESI ∩ S2)	Correctly identified (DESI ∪ S2)
All infested areas	49 %	50 %	45 %	54 %



# Conclusions

- DESIS data is suitable to detect changes in vegetation status over time also in **heterogeneous** natural forests
- Bark beetle infested areas can be detected with DESIS and Sentinel-2 (no early warning!)
  - ✓ Biophysical indices (esp. RedEdge parameters) reflect vegetation stress
- **Combined detection rate higher than individually**



Barkbeetle infested area  
Correctly identified by DESIS and Sentinel-2