Quantification of Birch and Bracken Encroachment on Heathland using Airborne Hyperspectral Imagery and Sentinel-2 Satellite Imagery

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Context

- British heathlands are valuable habitats for rare X and vulnerable ground nesting birds.
- In Bedfordshire, forestry and agriculture led to the decline of heathland in the 1800s but the RSPB has been working on restoring dry heathlands at the Sandy Lodge Reserve since 2005.
- Extensive birch and bracken encroachment on heather makes restoration work difficult and fragments the landscape.
- Heather coverage and fragmentation degree are \mathbf{X} estimated in the field and heathland condition is reported to Natural England on an annual basis.

Objectives

To classify heather, birch and bracken using \mathbf{X} spectral information.



Heather — Bracken — Birch

Figure 1. Average field spectra for heather (purple), birch (green) and bracken (yellow).



<u>Data</u>

- Processed Hyspex (VNIR 1800) and Phase One (iXA X 180) airborne imagery from 26th June 2018 – RGB truecolour, DSM and hyperspectral (186 bands).
- Sentinel-2 L2A satellite imagery from 26th June 2018. X
- Phase 1 Habitat Map manually updated from the RGB X true-colour airborne Phase One imagery.
- Heather, birch and bracken canopy dual ASD field spectroscopy data collected from Sandy on 13th August 2019 (Fig. 1)

Methods and Results

Heathlands were delineated using the Phase 1 map. X Two areas were selected for analysis: heathland 1 was heather-dominated with little fragmentation, while heathland 2 was more complex to classify (Fig. 2).

- To quantify the respective coverage of each class. \mathbf{X}
- To carry out classification independently for both \mathbf{X} hyperspectral airborne data and multispectral satellite imagery and compare the outputs.

We believe that remote sensing could be successfully used to improve current estimates of heather coverage and fragmentation, while allowing for consistent and efficient monitoring.



Multi-resolution

segmentation using RGB

Figure 2. Overview of the RSPB Sandy Reserve with the two heathlands of interest.

Sentinel-2 Classification



- Sentinel-2 classification was carried out on a pixel-X basis due to the low resolution. NDVI and NDI45 were calculated, and classification was achieved using thresholds for 3 classes only (Fig. 3).
- Hyperspectral airborne data was classified in 3 steps: 1) segmentation and masking, 2) pixel classification and 3) object classification (Fig. 4). This resulted in 7 classes (Fig. 5).
- Final classification maps were validated and class metrics were calculated (see the tables below).

Sentinel-2 Metrics

Heathland 1 Total Landscape Area: 44,297 m²

| | Heather | Green Vegetation | Bare Ground |
|-------------------------|---------|---------------------|-------------|
| Area (m²) | 23498 | 15899 | 4900 |
| Total perimeter (m) | 1900 | 1740 | 1080 |
| Landscape %area | 53 | 36 | 11 |
| Perimeter-Area Ratio | 0.08 | 0.11 | 0.22 |

Heathland 2 Total Landscape Area: 121,893 m²



Pixel

ENVI

Remaining unclassified objects exported as a shapefile for further classification to heather, birch and bracken

Spectral library created from ASD field data

Classification Spectral Angle Mapper (SAM) classification to generate 3 rule images for heather, birch and bracken

> Conversion from rule images to SAM score layers (Greiwe and Ehlers, 2012)

Chessboard segmentation Object ognition

of heather, birch and bracken SAM score layers using the unclassified objects shapefile

Class assigned to each object based on the highest mean SAM score

Figure 4. Methodology





Airborne Hyperspectral Classification

Figure 3. Sentinel-2 classified images for Heathland 1 (left) and Heathland 2 (right).

Green **Bare Ground** Heather Vegetation Area (m²) 14499 96694 10699 Total perimeter 2580 6940 1860 (m) Landscape 12 79 %area Perimeter-Area 0.18 0.07 0.17 Ratio

Airborne Hyperspectral Metrics

Heathland 1 Total Landscape Area: 33,722 m²

| | Heather | Birch | Bracken | Bare Ground |
|-------------------------|---------|-------|---------|----------------|
| Area (m²) | 20418 | 1645 | 3231 | 8428 |
| Total perimeter (m) | 36010 | 9108 | 18719 | 17709 |
| Landscape %area | 61 | 5 | 10 | 25 |
| Perimeter-Area Ratio | 1.76 | 5.54 | 5.79 | 2.10 |

Heathland 2 Total Landscape Area : 96,717 m²

| | Heather | Birch | Bracken | Bare Ground |
|-----------------|---------|-------|---------|----------------|
| Area (m²) | 40291 | 13112 | 26783 | 16532 |
| Total perimeter | | | | |
| (m) | 116066 | 34735 | 100946 | 49155 |





Buildings

Landscape %area 42 14 28 17 **Perimeter-Area** 2.88 2.65 3.77 2.97 Ratio

gec

<u>Conclusion</u>

Figure 5. Airborne hyperspectral classified images using the SAM-scores for Heathland 1 (left) and Heathland 2 (right)

The overall accuracy of heather classification for the airborne imagery was 95%, against 66% for Sentinel-2. For Heathland 1, both methods agreed well with the Phase

- X One imagery, although Sentinel-2 could not detect the paths and smaller bracken/birch patches. Heathland 2 was more of a challenge because of its mosaic composition.
- The main difficulty using the airborne data was the distinction between young birch with sparse canopy and bracken (42% and 48% accuracy respectively). This was taken X into account during the field collect and a wide variety of birch trees were sampled to mitigate for it. In contrast, Sentinel-2's resolution was too low and no CHM was available to distinguish between birch, bracken and other trees. It meant that results could not be directly compared to the airborne classification as only 3 classes were obtained.
- As expected, heather in Heathland 1 had a lower perimeter-area ratio than Heathland 2 for both airborne and satellite imagery, indicating \mathbf{X} less fragmentation. Comparison with the RSPB 2018 estimates is needed, as well as ground-truthing to validate the results.

References

Greiwe, A. and Ehlers, M. (2012) Combined Analysis of Hyperspectral and High Resolution Image Data in an Object Classification Approach.

Modified Copernicus Sentinel data 2019/Sentinel Hub.

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