Satellite remote sensing of plant functional diversity
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Satellite Remote Sensing of Plant Functional Diversity

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To Wil, Otto, and Elke

“The most striking feature of earth is the existence of life.

The most striking feature of life is its diversity”

David Tilman (2000)

Table of Contents

Chapter 1.: **General introduction** ... 10

1.1. On the importance of monitoring biodiversity ... 10

1.2. What is biodiversity? ... 10

1.3. The promise of remote sensing ... 11

1.3.1. Need for quantitative monitoring of large-scale biodiversity dynamics ... 11

1.3.2. The potential of optical remote sensing of vegetation ... 12

1.3.3. Translating spectra to plant diversity concepts ... 13

1.4. Challenges in linking ecological and remote sensing concepts of biodiversity ... 16

1.4.1. The next frontier: satellite remote sensing of plant biodiversity ... 16

1.4.2. Disparities in the concept of scale in ecology and remote sensing ... 18

1.4.3. Training and validation ... 19

1.5. Research aims ... 20

Chapter 2.: **Explaining discrepancies between spectral and in-situ plant diversity in multispectral satellite earth observation** ... 23

2.1. Introduction ... 24

2.2. Methodology ... 26

2.2.1. Study area ... 26

2.2.2. Data collection ... 28

2.2.2.1. Field data collection ... 28

2.2.2.2. Leaf biochemical traits ... 28

2.2.2.3. Sentinel-2 surface reflectance ... 29

2.2.3. Data analysis ... 29

2.2.3.1. Diversity metrics ... 29

2.2.3.2. Simulating spectral diversity through radiative transfer models ... 30

2.2.3.3. Statistical analysis ... 31

2.3. Results ... 32

2.3.1. Assessing links and discrepancies between spectra and in-situ traits through RTM simulations ... 32

2.3.2. Trait-, Taxonomic and Spectral diversity relationships in empirical data ... 34

2.3.3. Multivariate constituents of spectral diversity through linear mixed-effect models ... 35

2.4. Discussion ... 36

2.4.1. Leaf and canopy simulations show large differences in relation to empirical observations ... 36

2.4.2. Vegetation cover is dominant in spectral diversity signal ... 37

2.4.3. Spectral Variability Hypothesis works for taxonomic diversity, the underlying mechanism remains unexplained ... 38

2.4.4. Absence of leaf trait diversity in spectral diversity signal ... 39

2.4.5. Expanding spectral diversity applications ... 39

2.5. Conclusions ... 40

Chapter 3.: **Towards scalable estimation of plant functional diversity from Sentinel-2 imagery: in-situ validation in a heterogeneous (semi-)natural landscape** 42
3.1. Introduction 43
3.2. Methods 45
3.2.1. Study area 45
3.2.2. Field measured plant traits 46
3.2.3. Remotely sensed plant traits 47
3.2.3.1. Sentinel-2 data 47
3.2.3.2. Radiative transfer model inversion 47
3.2.3.2.1. Look-up Table (LUT)-based inversion 48
3.2.3.2.2. Sentinel Application Platform Biophysical processor 49
3.2.3.2.3. PROSAIL-D/Support Vector Regression hybrid approach 49
3.2.4. Functional and taxonomic diversity estimations 50
3.2.5. Statistical analysis 51
3.3. Results 52
3.3.1. Trait estimates 52
3.3.2. Functional diversity estimates 57
3.4. Discussion 58
3.4.1. Estimating canopy and leaf traits 58
3.4.2. Estimating multivariate functional diversity 60
3.4.3. Ecological implications 61
3.5. Conclusions 63
Chapter 4.: **Linking land use and plant functional diversity patterns in Sabah, Borneo, through large-scale spatially continuous Sentinel-2 inference** 64
4.1. Introduction 65
4.2. Methods 67
4.2.1. Study area 67
4.2.2. Retrieval of functional traits 67
4.2.3. Estimating functional diversity 68
4.2.4. Land use data 69
4.2.5. Data analysis 69
4.3. Results 70
4.3.1. From mapping spatially explicit spectral trait indicators to functional diversity estimates 70
4.3.2. Land use patterns of plant functional diversity 72
4.4. Discussion 73
4.4.1. Functional diversity retrieval 73
4.4.2. Land use gradient as qualitative assessment 74
4.4.3. Outlook 76
4.5. Conclusion 76
Chapter 5.: **Sizing up the scale dependence of satellite-based plant diversity estimates: Functional diversity-area relationships observed through Sentinel-2 over the Bornean rainforest-plantation matrix** 78

5.1. Introduction 79
5.2. Methods 82
5.2.1. Study area 82
5.2.2. Datasets 82
5.2.3. Functional diversity 84
5.2.4. Scaling of plots 85
5.2.5. Data analysis 86
5.3. Results 87
5.3.1. FAR against null-model predictions 87
5.3.2. FAR across land use types 88
5.3.3. The scale dependency of environmental predictors 89
5.4. Discussion 89
5.4.1. Comparison against field and airborne studies 90
5.4.2. Passive sampling hypothesis 91
5.4.3. Trait convergence 92
5.4.4. Environmental drivers 93
5.4.5. Alpha and beta diversity components 93
5.4.6. Recommendations 94
5.4.7. Limitations 95
5.5. Conclusions 95
Chapter 6.: **General discussion** 97
6.1. Lessons learned 98
6.1.1. Disentangling spectral diversity 98
6.1.2. Physics-based estimation of functional diversity 100
6.1.3. Validation of satellite remotely sensed plant diversity 103
6.1.4. Large-scale spatially continuous application 104
6.2. Considerations of scale dimensions 105
6.2.1. Spatial scale and resolution 105
6.2.2. Spectral resolution 108
6.2.3. Temporal dimension 109
6.3. Future outlook 110
6.4. Conclusions 113
Chapter 7.: **Supplementary Materials** 115
Chapter 8.: **References** 146
I. **Summary** 176
II. **Samenvatting** 178
III. **Acknowledgements** 180
IV. **Curriculum Vitae** 182
V. **Publications** 183