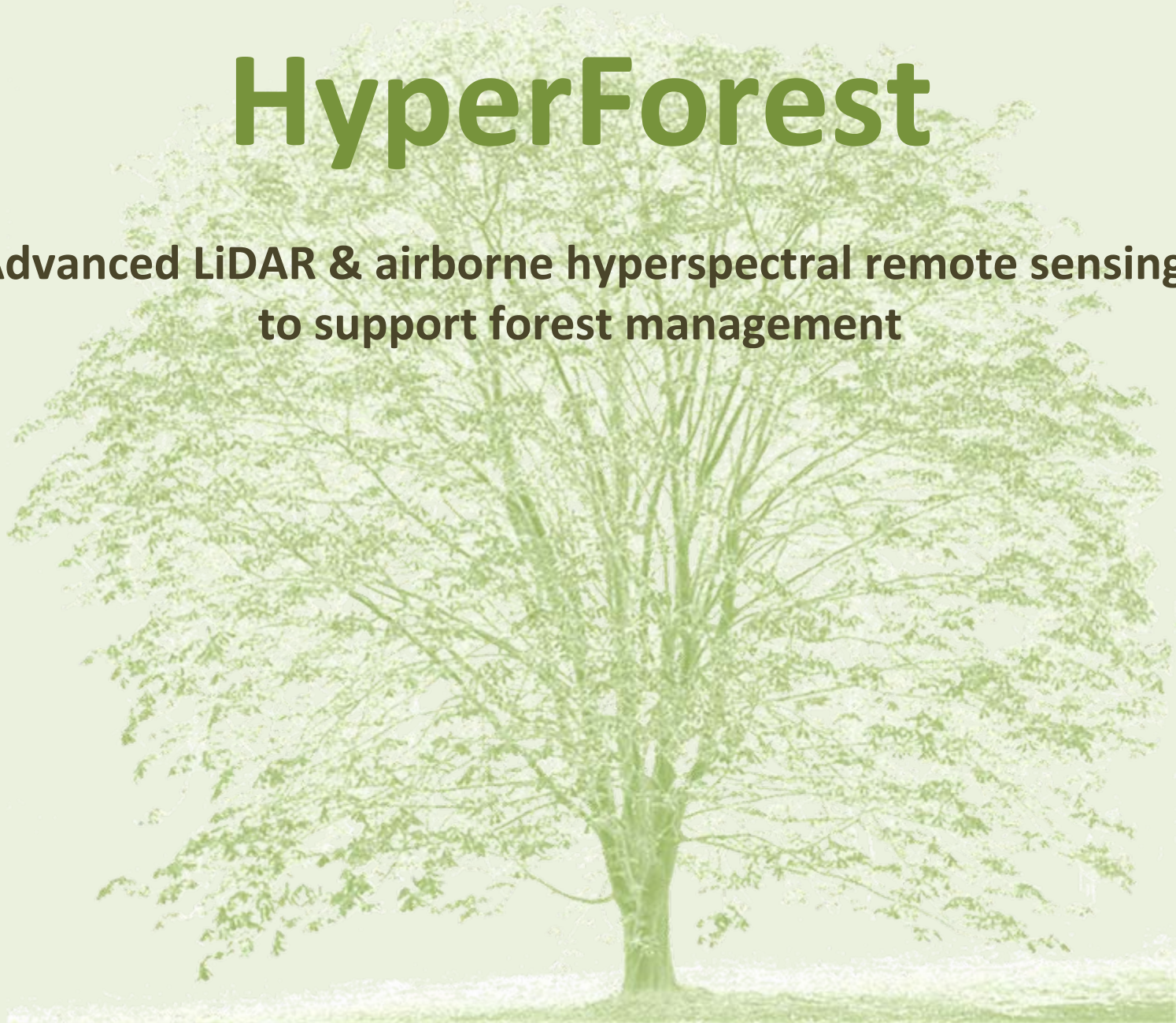


HyperForest

Advanced LiDAR & airborne hyperspectral remote sensing
to support forest management



HyperForest partners



Introduction

- In the framework of sustainable forest management (SFM), there is a need for **reliable data on forest parameters** such as:

tree species composition;

stand diversity;

forest vitality.

- These parameters need to be reported at regular intervals at national and international level.



Introduction

- Currently, data acquisition is done by **time-consuming and labor-intensive field campaigns** and specific aspects such as canopy structure are even difficult to directly measure.
- **Hyperspectral (HS)** and **LiDAR** remote sensing techniques offer the potential to facilitate and improve information acquisition.
- However, this potential still has to be demonstrated in **highly structured closed forests**.

Challenge

Reference: structured forest with crown closure

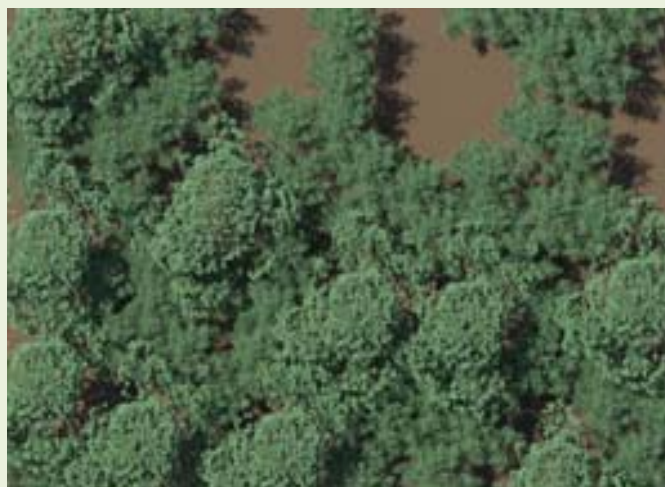
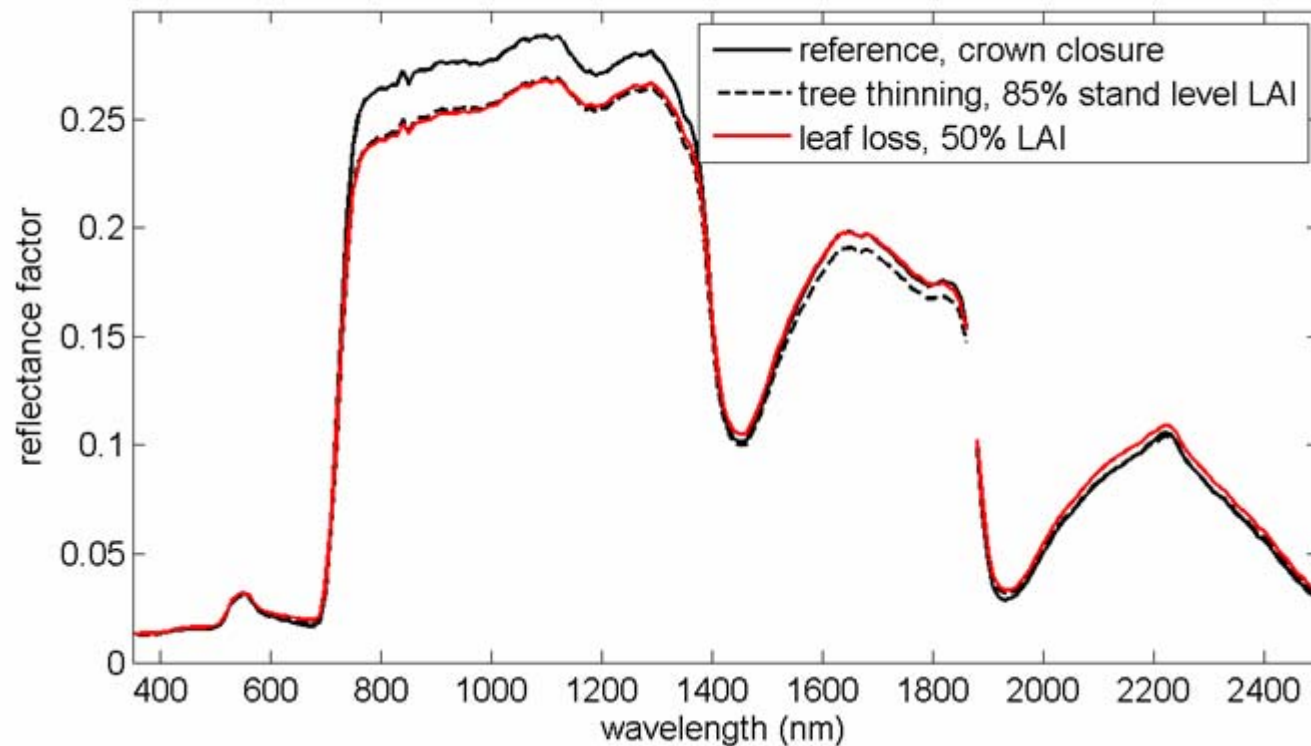


- *Hyperspectral ray-tracing with pbrt*
- *Trees generated with Bionatics software*
- *Displayed: RGB as [650, 550, 450] with Gamma correction*



Sc1: thinning / uprooting by wind (-15%) Sc2: leaf loss (50% drop in LAI)





Main objective

- Improved **data acquisition** and **processing** for better estimation of forest parameters by **fusion of HS and LiDAR data** with focus on:

tree species composition;

stand diversity;

forest vitality.



Main objective

This requires:

- A fundamental study on the impact of 3D canopy structure variability on the hyperspectral canopy signal.
- Data fusion between ground-based/airborne LiDAR and hyperspectral datasets.
- Improvement of the established hyperspectral pre-processing chain by incorporation of 3D structure information.
- Incorporation of acquired RS data and pre-processing techniques in the development of optimized hyperspectral feature extraction.

Project overview

Measurement campaign

Impact of 3D canopy structure on HS signal

Data fusion between RS data sets

Standard/Advanced HS pre-processing

Improved feature extraction from combined RS data

Output dissemination

Project overview

**Measurement
campaign**

Impact of 3D canopy structure on HS signal

Data fusion between RS data sets

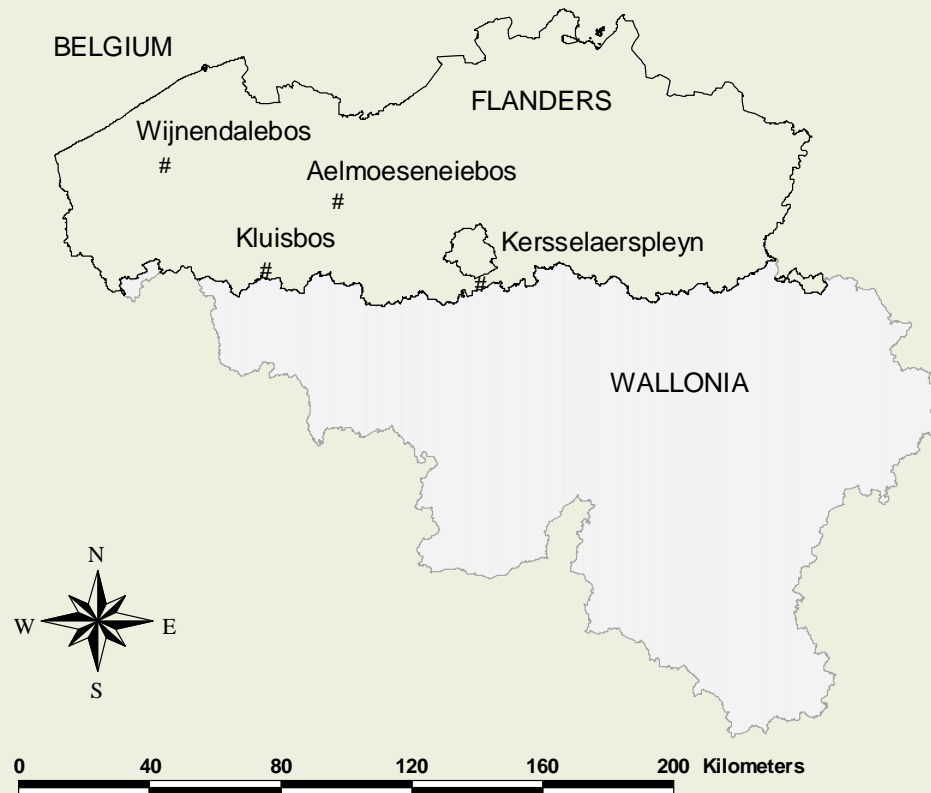
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Output dissemination

Measurement campaign

Four test sites with increasing structural complexity:



Measurement campaign

Four test sites with increasing structural complexity:

Increasing structural complexity

1. Kluisbos
→ homogeneous beech stands;
2. Kersselaerspleyn (Sonian forest)
→ homogeneous old beech stands with larger gaps;
3. Wijnendale forest
→ mixed oak forest with maple, beech, larch, ...;
4. Aelmoeseneie forest
→ mixed oak, beech, ash and larch stands (measuring tower of 40 m height).



Measurement campaign

Airborne flight campaigns

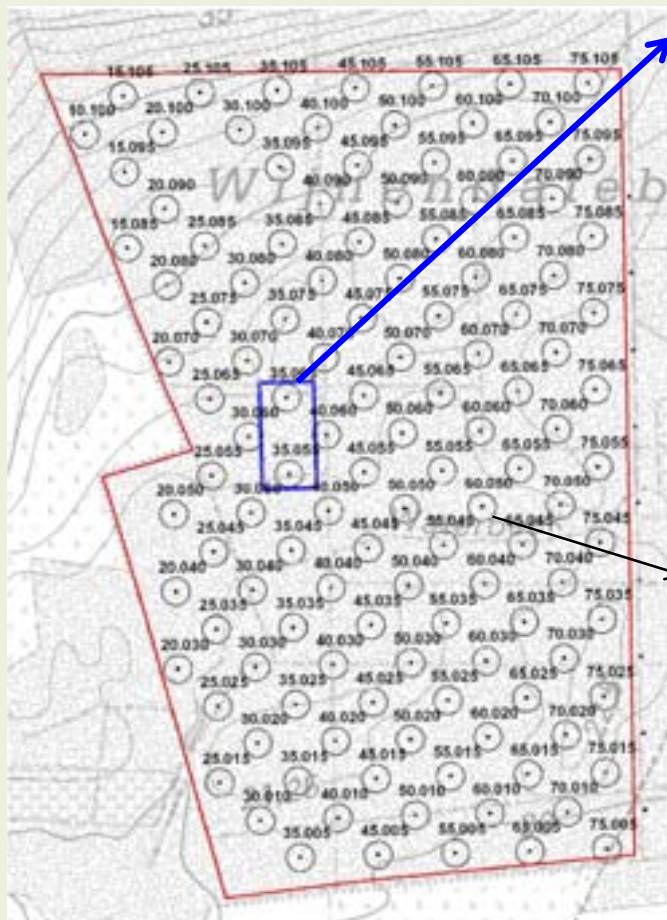
- **HS data: CASI-1500 (INTA)**
spatial resolution: 1m
nr bands: up to 288
wavelength range: 380nm-1050nm
FOV: 40° across track over 1500 pixels
Swath width: 1000m
- **HS data – AISA Eagle (dataset – EUFAR proposal)**
spatial resolution: 1m
nr bands: 32
wavelength range: 412nm-867nm
FOV: 39,7° across track over 1024 pixels
Swath width: 1000m
- **LiDAR data from TopoSys Sensor Harrier 56**
spatial resolution: 1m
range capture: full waveform
spot diameter: 0.5m at flying altitude of 1000m
range accuracy: 15-30cm
point density: 10 points per m²



Measurement campaign

Field measurements

Each test site includes:



Full dendrometric inventories

- tree position;
- species composition;
- DBH all trees > 5 cm diameter;
- tree heights all trees upper canopy;
- canopy gaps (hemispheric photos);
- tree vitality (international methodology for level I forest vitality evaluation).

Dendrometric inventories

- tree position;
- species registration;
- DBH & tree height selection of trees;
- canopy gaps (hemispherical photos).

Measurement campaign

Field measurements

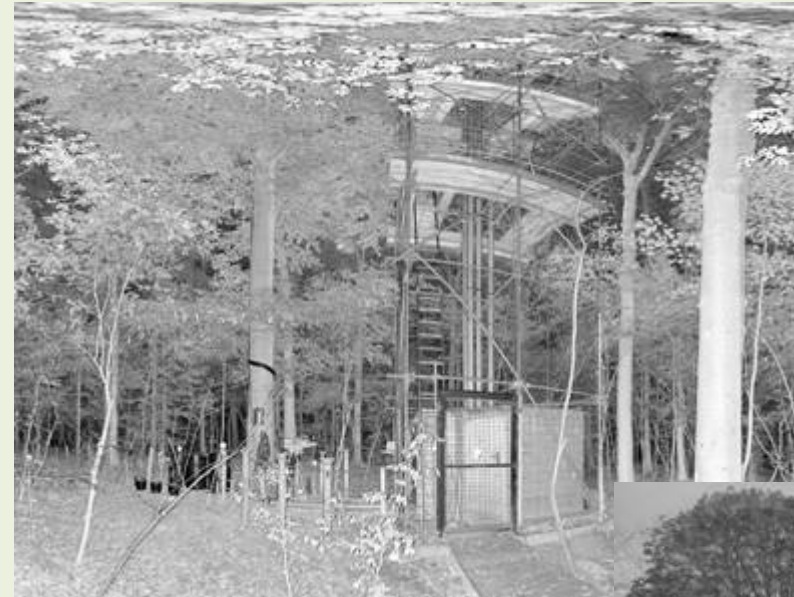
- In selected canopies: leaf picking and analysis (chlorophyll, water and dry matter content).
- Collection of reference data:
 1. Reference leaf reflectance and transmission measurement using field spectrometer (ASD FieldSpec3 with an integrating sphere).
 2. Measuring tower: HS signal retrieval above canopy using field spectro-radiometers (ASD, SpectraVista);



Measurement campaign

Field measurements

- In selected canopies: leaf picking and analysis (chlorophyll, water and dry matter content).
- Collection of reference data:
 3. Ground-based LiDAR structure measurements;



Measurement campaign

Field measurements

- In selected canopies: leaf picking and analysis (chlorophyll, water and dry matter content).
- Collection of reference data:
 3. Ground-based LiDAR structure measurements;



Project overview

Measurement campaign

Impact of 3D canopy structure on HS signal

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Impact of 3D canopy structure on HS signal



Goal: What is the impact of 3D canopy structure variability on the hyperspectral canopy signal?

Approach: Mapping and quantifying the contribution of the 3D distribution of vegetative elements to the HS reflectance signal using detailed structure data and geometrically explicit radiative transfer models

Approach

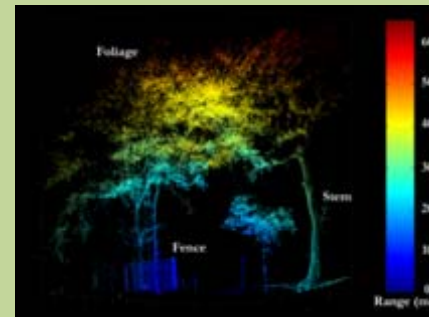
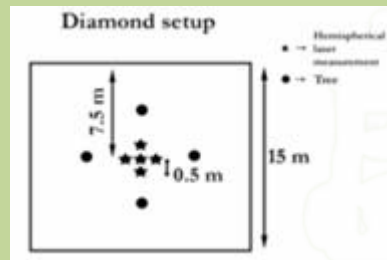
1. Detailed 3D structure description of canopy using terrestrial LiDAR technology

Hemispherical Measurement pattern



FARO LMS8800

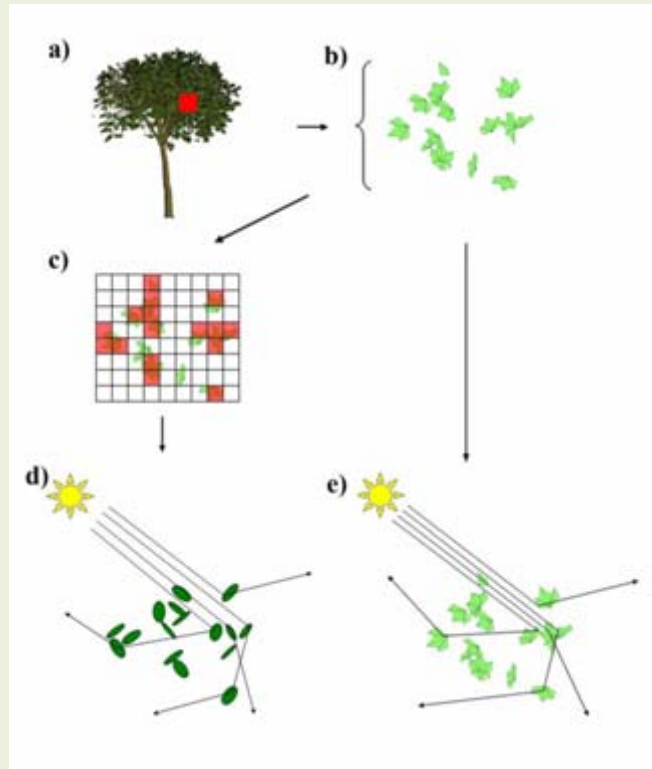
Sampling design



**LiDAR data of high
quality optimized for
structural feature
extraction**

Approach

1. Detailed 3D structure description of canopy using terrestrial LiDAR technology
2. Model light / vegetation interactions with geometrically explicit radiative transfer models (VLIM-DART)

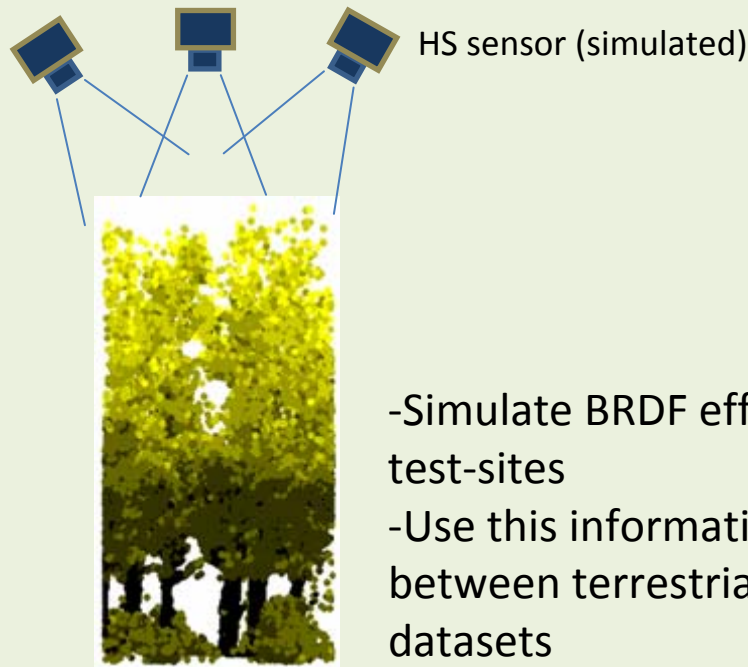


Voxel-based Light Interception Model (VLIM)

Use VLIM and DART model to determine the light / vegetation interactions in high detail (to cm scale ~ leaf level)

Approach

1. Detailed 3D structure description of canopy using terrestrial LiDAR technology
2. Model light / vegetation interactions with geometrically explicit radiative transfer models (VLIM-DART)
3. Identify and list vegetation structure elements which contribute most to the HS reflectance of forest canopies



- Simulate BRDF effects from data derived from test-sites
- Use this information to support data fusion between terrestrial and airborne LiDAR datasets

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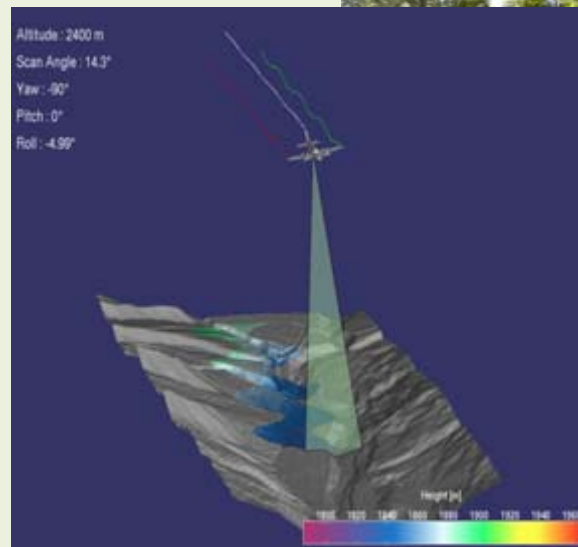
Output dissemination

Data fusion between RS data sets

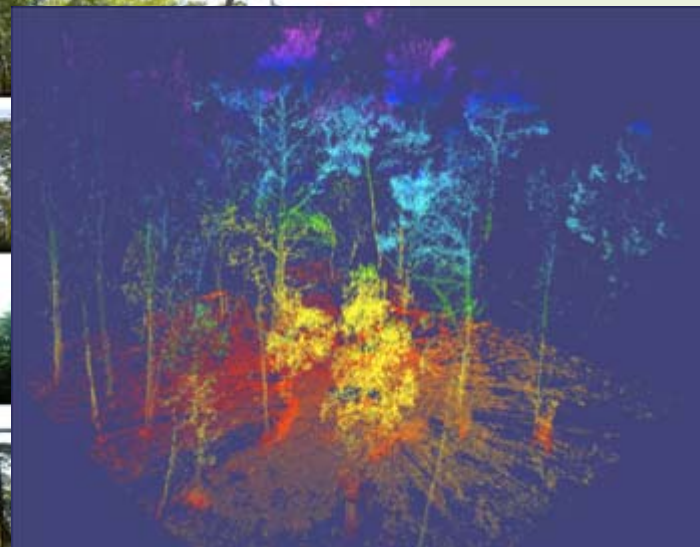
Goal: How to integrate the contribution of the 3D distribution of vegetative elements in airborne hyperspectral reflectance data of forest stands

Approach: Creating a realistic “virtual environment” using a radiative transfer model (DART), based on derived structural canopy information (ALS). This allows assessing the impact of structure at several simplifications levels

ALS



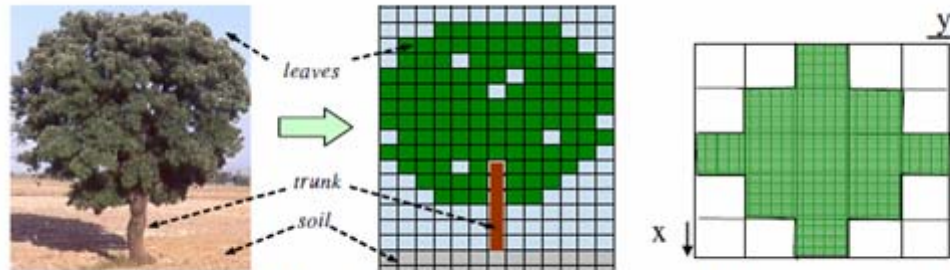
TLS



Approach

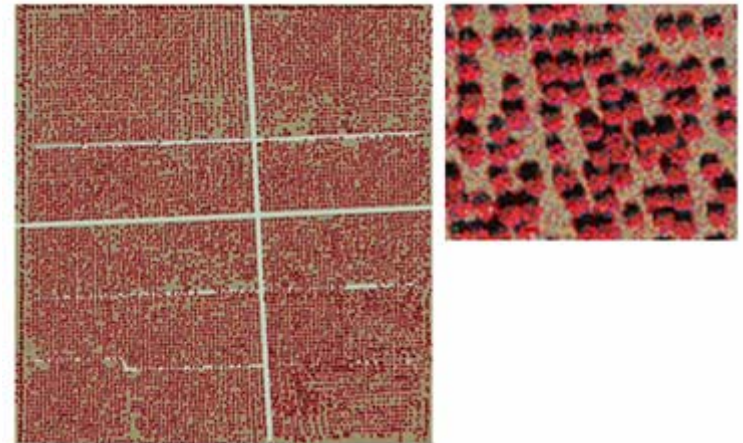
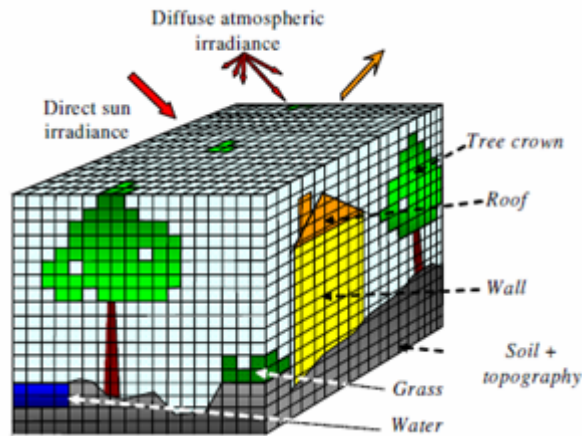
Simulation of HS data using radiative transfer modelling

Discrete Anisotropic Radiative Transfer Modelling (DART)



Cells of the scene are stored in file mak with the (y, x, z) sequence: $(0,0,0), (1,0,0), \dots$

DART simulation of a tree. Vertical (b) and horizontal (c) sections.



Project overview

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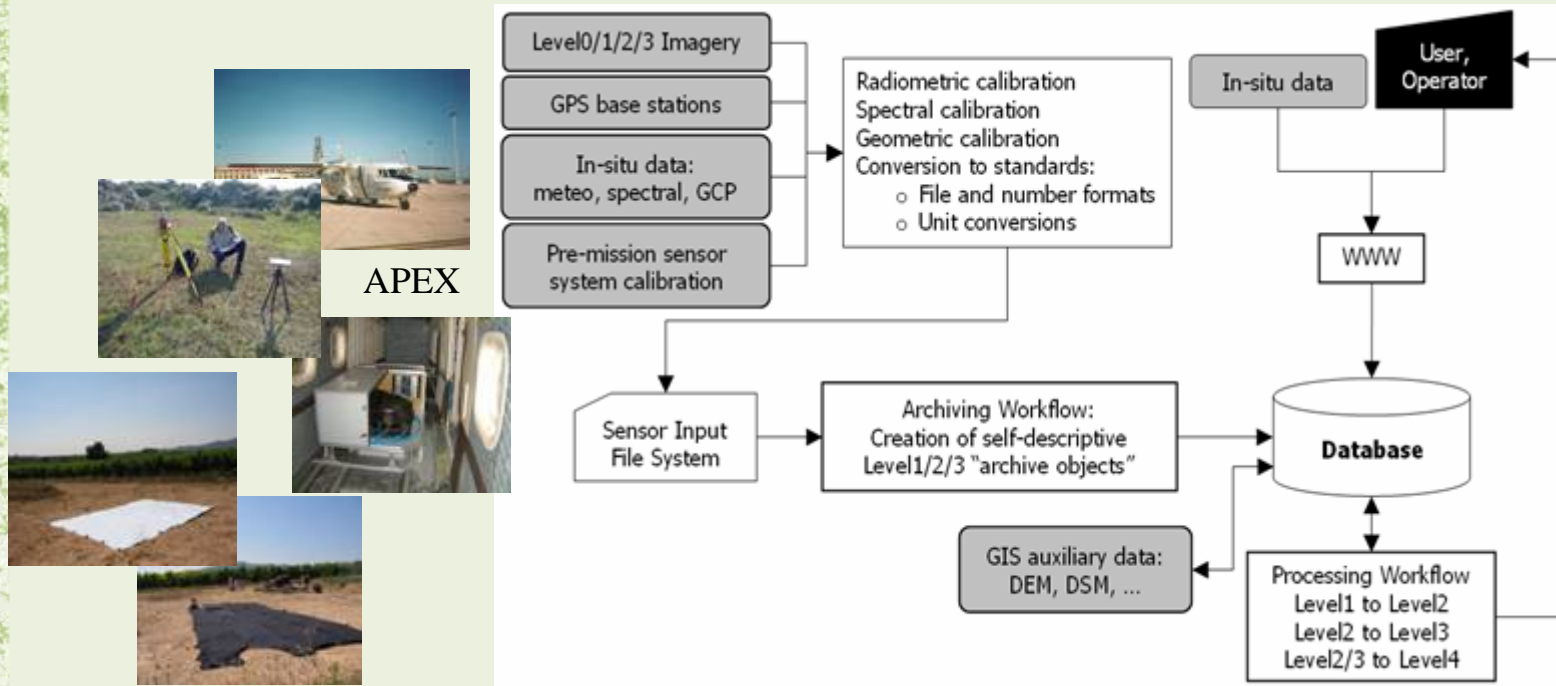
Standard/Advanced HS pre-processing

Improved feature extraction from combined RS data

Output dissemination

Standard/Advanced HS pre-processing

Central Data Processing Centre (CDPC)



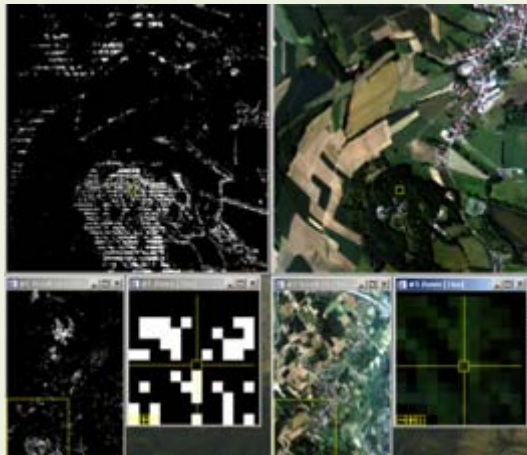
Goal: How to improve the current operational processing chain by integrating structure information?

Approach: The structure effects will be incorporated into the processing chain at three different levels.

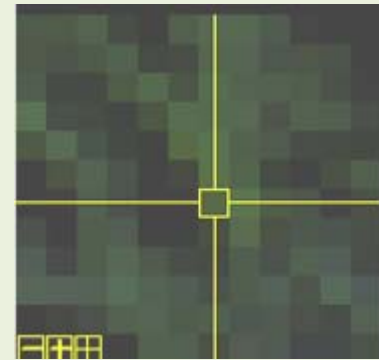
Approach

1. Visibility estimation from the imagery itself

Account for vegetation structure when deriving visibility from the image:



Left: Dense Dark Vegetation (DDV) mask
Right: Hyperspectral image

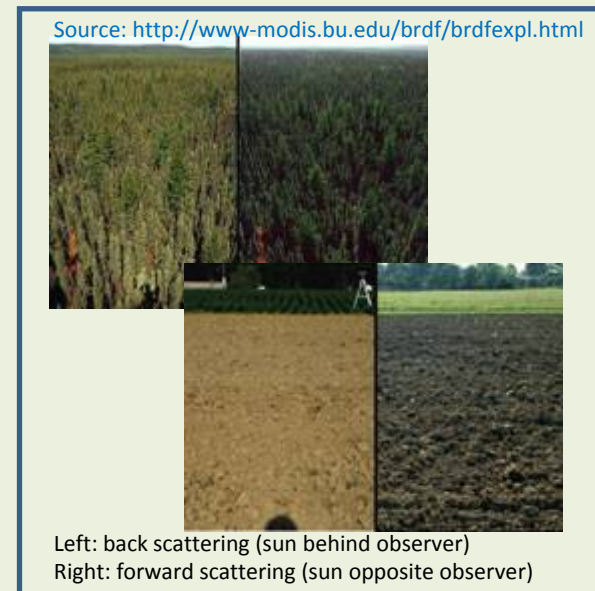
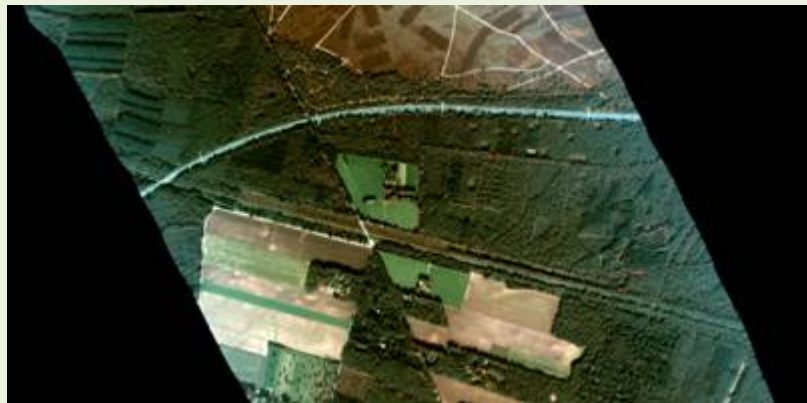


Structure influences retrieval of correct visibility values!!

→ this allows for a more precise atmospheric correction.

Approach

1. Visibility estimation from the imagery itself
2. View and illumination angle effects seen by a HS image



Optimizing the kernel based BRDF correction by taking into account forest structure:

- needed for a more accurate classification (e.g. pine, deciduous, mixed forest);
- kernel correction coefficients depend on forest structure (e.g. via look-up table).

Approach

1. Visibility estimation from the imagery itself
2. View and illumination angle effects seen by a HS image
3. Structure normalization

The standard structure serves as the reference for the structure correction.

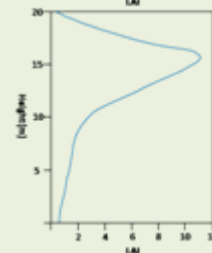
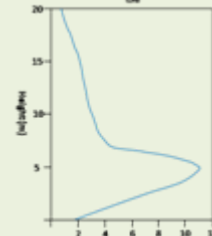
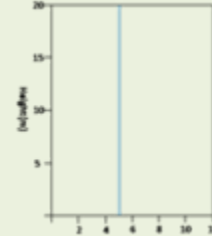


Standard
3D Poisson distribution
(LAI = 5)

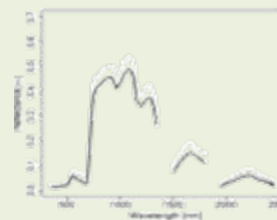
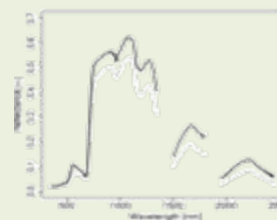
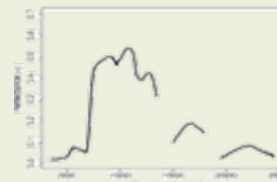
Lower level vegetation
maximum
(LAI = 5)

Upper level vegetation
maximum
(LAI = 5)

Forest structure



Hyperspectral



Correction
factor
for forest
structure
(per
wavelength)

$$R'_{1\lambda} = R_{\lambda} * \alpha_{corr^{1\lambda}}$$

$$R'_{2\lambda} = R_{\lambda} * \alpha_{corr^{2\lambda}}$$

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Improved feature extraction from combined RS data

Goal: How to optimally apply/process HS images & LiDAR data in highly structured forests for a thorough forest diversity analysis?

Approach: Development of objective indicators quantifying forest diversity, defined by three components (1) tree species composition, (2) stand diversity and (3) forest vitality following three different working strategies:

1. standard pre-processed HS signal;
2. standard pre-processed HS and pre-processed airborne LiDAR data fusion sets;
3. advanced pre-processed HS signal.

Approach

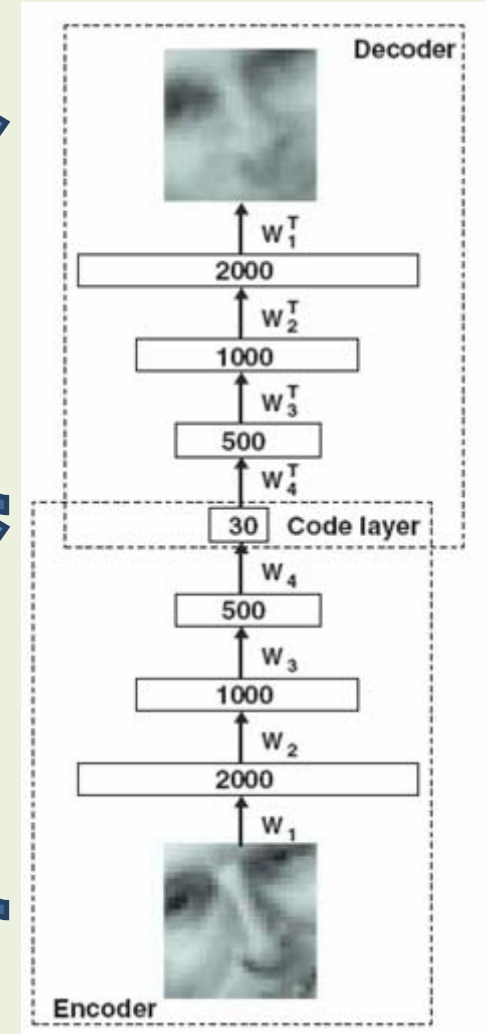
Development of an objective, robust & integrated method by implementing deep belief neural networks (DBNN)

DBNN = auto-encoder networks: a network that is trained to reproduce its input on its output – an identity mapping - by standard backpropagation of the error

Decoder network: recover the data from the code

Encoder network: transform the high-dimensional data into low dimensional codes/features

assembling band selection,
band combination and classification



Approach

- extract the codes/features;
- intensive study of the codes and assess their potential as optimized VI;
- test the composed VI on their accuracy and reliability as proxies/indicators for
 - (1) tree species composition;
 - (2) stand diversity;
 - (3) forest vitality.

Varying input possibilities for DBNN (working strategies):

Standard pre-processed HS signal



DBNN



diversity indicators

REFERENCE

Standard pre-processed
HS signal & LiDAR data
sets



DBNN



diversity indicators

ASSET RELATED TO
END-USER NEEDS?

Advanced pre-processed HS signal



DBNN



diversity indicators

ASSET RELATED TO
END-USER NEEDS?

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Output dissemination



Involvement of potential end-user community and dissemination of results

Different end-users depending on the specific output:

- Output focussing on the development of techniques to improve the correction of HS data by incorporating correction algorithms for canopy roughness, etc...

→ end-users in remote sensing community.

- Output focussing on application of RS data for description and quantification (with indexes) of forest diversity parameters

→ end-users in forest surveys and ecology research;

→ periodic surveys for forest administration and policy.

- Output focussing on the application of RS data for evaluation of forest vitality.

→ end-users in forest vitality monitoring.

→ INBO as customer / test-pilot.