Identification of Tree Species of Individual Trees by Combining Very High Resolution Laser Data with Multi-Spectral Images

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# Objectives

- Identify tree species of individual trees (Norway spruce, Scots pine, deciduous trees) through combining features of high resolution laser data with high resolution multi-spectral images
  - 1. Delineation of single tree crowns (laser data)
  - 2. Estimation of tree attributes (laser data)
  - 3. Classification of tree species (laser data+aerial images)

# Material

## Test site in southern Sweden

### Laser data

- System: TopEye Mk II
- Date: August 2004
- Flight height: 130 m
- Wavelength: 1064 nm
- Pulsing frequency: 50 kHz
- Pulse length: 5 ns
- Beam divergence: 1 mrad
- Point density: 50 points/m<sup>2</sup>

## Field data

14 plots (50x20 or 80x80 m<sup>2</sup>)

- Norway spruce (six plots)
- Scots pine (six plots)
- Deciduous (two plots)
- Tree position
- Stem diameter
- Tree species
- Tree height (sample trees)
- Crown base height (sample trees)



## Multi-spectral images

Z/I Digital Mapping Camera (DMC)

Four panchromatic images -> single high resolution image (PAN)

Three multi-spectral cameras (CIR image)

- B1 (500-560 nm)
- B2 (590-675 nm)
- B3 (675-850 nm)

High resolution PAN image (0.1 m) Lower resolution CIR image (0.6 m)

Two sets of images: October 2003 June 2005

Flight altitude: 1200 m



# Method



Laser data

- 1. Delineation of single tree crowns
- 2. Estimation of tree attributes
  - tree height
  - crown, stem diameter
  - timber volume

mapping of crown segments





Multi-spectral image (not orthorectified)

3. Classification of tree species

through combining features from -laser measurements -multi-spectral images

## Features – laser data

#### Estimation of crown base height



- Approximate shape of trees using Alpha Shapes ( $\alpha$ =1.5 m)
- Derived from Delaunay triangulation
- Minimum area -> estimated crown base height

- height distribution
- proportion of different pulse types
- canopy shape
- intensity of returns
- clustering of returns

## Features - multi-spectral images

- spectral mean values from the three bands





Spruce



Deciduous

#### Laser variables



#### **Multi-spectral variables**



## Results

| Cb                                                  | Sm                                        | Sf                                          | Рс                                        | Sr                                                  | Ps                                             | Im                                     | Kr                                             | b3                                                       | bź                  | 2 b                                                      | 1 Prop                                                                                                            |  |
|-----------------------------------------------------|-------------------------------------------|---------------------------------------------|-------------------------------------------|-----------------------------------------------------|------------------------------------------------|----------------------------------------|------------------------------------------------|----------------------------------------------------------|---------------------|----------------------------------------------------------|-------------------------------------------------------------------------------------------------------------------|--|
| Las                                                 | er                                        |                                             |                                           |                                                     |                                                |                                        |                                                |                                                          |                     |                                                          |                                                                                                                   |  |
| 0<br>1<br>1<br>1<br><b>1</b><br>1                   | 1<br>1<br>1<br>1<br><b>1</b><br>1         | 0<br>0<br>0<br>0<br><b>1</b><br>1           | 0<br>1<br>1<br>1<br><b>1</b><br>1<br>1    | 0<br>0<br>0<br>0<br>0<br>1<br>1                     | 0<br>0<br>0<br>1<br><b>1</b><br>1              | 0<br>0<br>1<br>0<br>0<br>1             | 0<br>0<br>0<br>1<br><b>1</b><br>1              |                                                          |                     |                                                          | 0.7124<br>0.8420<br>0.8536<br>0.8635<br>0.8664<br><b>0.8727</b><br>0.8687<br>0.8710                               |  |
| Las                                                 | er + C                                    | MC (                                        | autu                                      | mn)                                                 |                                                |                                        |                                                |                                                          |                     |                                                          |                                                                                                                   |  |
| 0<br>0<br>0<br>0<br>0<br>1<br>1<br>1<br>1           | 0<br>0<br>1<br>1<br>1<br>1<br>1<br>1      | 0<br>0<br>0<br>0<br>0<br>0<br>0<br>1<br>1   | 0<br>0<br>1<br>1<br>1<br>1<br>1<br>1<br>1 | 0<br>0<br>0<br>0<br>0<br>0<br>1<br>1<br>1           | 0<br>0<br>0<br>0<br>0<br>0<br>0<br>0<br>0<br>0 | 0<br>0<br>0<br>1<br>1<br><b>1</b><br>1 | 0<br>0<br>0<br>0<br>0<br>0<br>0<br>0<br>1      | 0<br>1<br>1<br>1<br>1<br>1<br>1<br>1<br>1<br>1<br>1      | 101111 <b>1</b> 111 | 0<br>1<br>0<br>1<br>1<br>1<br>1<br>1<br>1                | 0.7205<br>0.8896<br>0.9332<br>0.9384<br>0.9460<br>0.9477<br>0.9500<br><b>0.9512</b><br>0.9483<br>0.9465<br>0.9465 |  |
| Las                                                 | er + C                                    | MC (                                        | sum                                       | mer)                                                |                                                |                                        |                                                |                                                          |                     |                                                          |                                                                                                                   |  |
| 0<br>0<br>0<br>0<br>0<br>0<br>1<br>1<br>1<br>1<br>1 | 1<br>1<br>1<br>1<br>1<br>1<br>1<br>1<br>1 | 0<br>0<br>0<br>0<br>1<br>1<br><b>1</b><br>1 | 0<br>1<br>1<br>1<br>1<br>1<br>1<br>1<br>1 | 0<br>0<br>0<br>0<br>0<br>0<br>0<br>0<br>0<br>1<br>1 | 0<br>0<br>1<br>1<br>0<br>1<br><b>1</b><br>0    | 0<br>0<br>0<br>1<br>1<br>1<br>1<br>1   | 0<br>0<br>0<br>0<br>0<br>0<br>0<br>0<br>1<br>1 | 0<br>0<br>1<br>1<br>1<br>1<br>1<br>1<br>1<br>1<br>1<br>1 | 00011111111111111   | 0<br>0<br>0<br>0<br>0<br>0<br>0<br>0<br>0<br>0<br>1<br>1 | 0.7124<br>0.8420<br>0.9076<br>0.9227<br>0.9239<br>0.9274<br>0.9285<br><b>0.9291</b><br>0.9285<br>0.9285<br>0.9262 |  |

| b3 | b2   | b1   | Prop   |
|----|------|------|--------|
| DM | C (a | utum | n)     |
| 0  | 1    | 0    | 0.7205 |
| 1  | 0    | 1    | 0.8896 |
| 1  | 1    | 1    | 0.9088 |
| DM | C (s | umm  | er)    |
| 0  | 1    | 0    | 0.6519 |
| 0  | 1    | 1    | 0.7786 |
| 1  | 1    | 1    | 0.8321 |

| Lacor                 |             |        |           |       |  |  |  |
|-----------------------|-------------|--------|-----------|-------|--|--|--|
|                       | _           |        |           |       |  |  |  |
| Classified            | True groups |        |           |       |  |  |  |
|                       | Pine        | Spruce | Deciduous | Total |  |  |  |
| Pine                  | 482         | 58     | 56        |       |  |  |  |
| Spruce                | 34          | 628    | 15        |       |  |  |  |
| Deciduous             | 34          | 22     | 392       |       |  |  |  |
| Proportion correct    | 0.876       | 0.887  | 0.847     | 0.873 |  |  |  |
| DMC <sub>autumn</sub> |             |        |           |       |  |  |  |
| Classified            | True groups |        |           |       |  |  |  |
|                       | Pine        | Spruce | Deciduous | Total |  |  |  |
| Pine                  | 480         | 42     | 9         |       |  |  |  |
| Spruce                | 64          | 652    | 22        |       |  |  |  |
| Deciduous             | 6           | 14     | 432       |       |  |  |  |
| Proportion correct    | 0.873       | 0.921  | 0.933     | 0.909 |  |  |  |
| DMC <sub>summer</sub> |             |        |           |       |  |  |  |
| Classified            | True groups |        |           |       |  |  |  |
|                       | Pine        | Spruce | Deciduous | Total |  |  |  |
| Pine                  | 458         | 83     | 29        |       |  |  |  |
| Spruce                | 60          | 563    | 23        |       |  |  |  |
| Deciduous             | 32          | 62     | 411       |       |  |  |  |
| Proportion correct    | 0.833       | 0.795  | 0.888     | 0.832 |  |  |  |

| Laser + DMC <sub>autumn</sub>                           |                                                           |                                   |                              |       |  |  |  |
|---------------------------------------------------------|-----------------------------------------------------------|-----------------------------------|------------------------------|-------|--|--|--|
| Classified                                              | True gi                                                   | True groups                       |                              |       |  |  |  |
|                                                         | Pine                                                      | Spruce                            | Deciduous                    | Total |  |  |  |
| Pine                                                    | 520                                                       | 23                                | 6                            |       |  |  |  |
| Spruce                                                  | 25                                                        | 672                               | 12                           |       |  |  |  |
| Deciduous                                               | 5                                                         | 13                                | 445                          |       |  |  |  |
| Proportion correct                                      | 0.945                                                     | 0.949                             | 0.961                        | 0.951 |  |  |  |
| Laser + DMC <sub>summer</sub>                           |                                                           |                                   |                              |       |  |  |  |
| Laser + DM                                              | C <sub>summer</sub>                                       |                                   |                              |       |  |  |  |
| Laser + DM<br>Classified                                | <b>C<sub>summer</sub></b><br>True gi                      | roups                             |                              |       |  |  |  |
| Laser + DM<br>Classified                                | <b>C<sub>summer</sub></b><br>True gi<br>Pine              | roups<br>Spruce                   | Deciduous                    | Total |  |  |  |
| Laser + DM<br>Classified<br>Pine                        | C <sub>summer</sub><br>True gi<br>Pine<br>502             | roups<br>Spruce<br>34             | Deciduous<br>15              | Total |  |  |  |
| Laser + DM<br>Classified<br>Pine<br>Spruce              | C <sub>summer</sub><br>True gi<br>Pine<br>502<br>34       | roups<br>Spruce<br>34<br>665      | Deciduous<br>15<br>16        | Total |  |  |  |
| Laser + DM<br>Classified<br>Pine<br>Spruce<br>Deciduous | C <sub>summer</sub><br>True gi<br>Pine<br>502<br>34<br>14 | roups<br>Spruce<br>34<br>665<br>9 | Deciduous<br>15<br>16<br>432 | Total |  |  |  |



pine spruce deciduous





plot 12 (spruce)

