

# Estimation of Growth Rates at Kielder Forest using Airborne Laser Scanning

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# Introduction

## *'Estimation of Growth Rates at Kielder Forest using Airborne Laser Scanning'*

- Forest Management - up-to-date, accurate data
- ALS has shown promise for tree height and biomass
- Carbon stocks & climate change
- Assess potential for growth
- Error quantification

Introduction

Background

Aims & Originality

Field Location

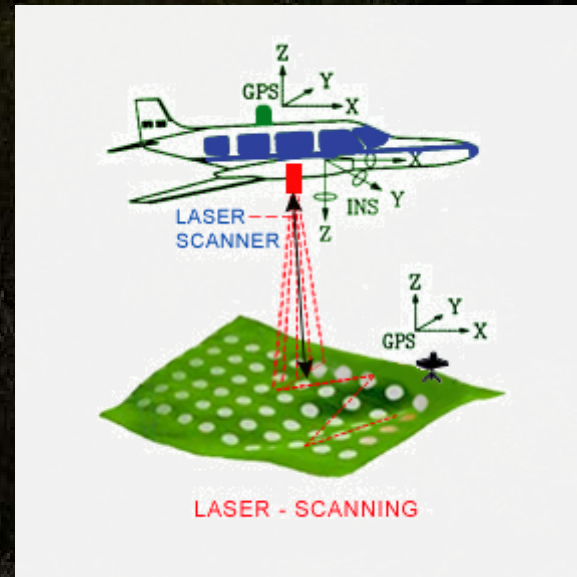
LiDAR Processing

Ground Truthing

Results

Discussion

Conclusion



Source: [www.gis.gov.ae](http://www.gis.gov.ae)



# Background

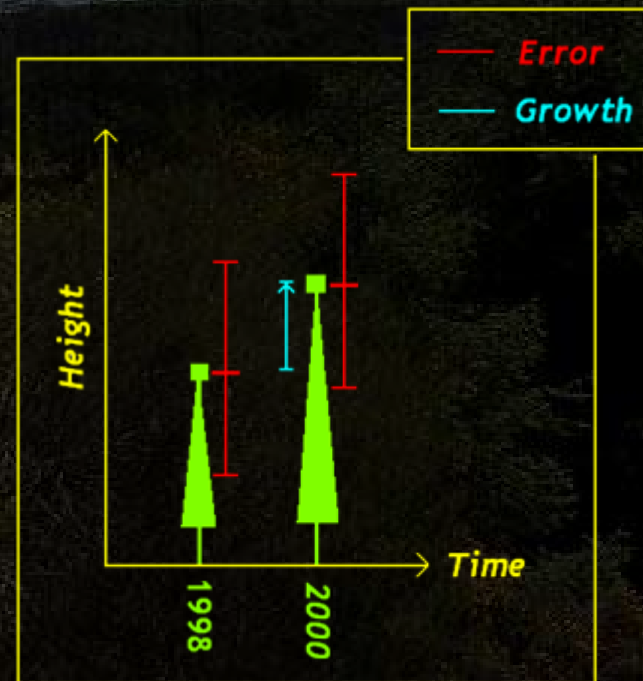
## *Use of LiDAR for Growth Estimation*

### Yu et al., 2004

- Kalkinen, Finland
- 1998-2000
- Tree-to-tree matching algorithms
- $R^2 = 0.29$
- Height underestimation - 67cm = serious issue!

### Yu et al., 2006

- Follow up paper
- 1998-2003
- Hausdorff technique
- $R^2 = 0.68$



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# Background

*The Focus So Far...*

## Geographical Region:

Less densely stocked, slow growing forests of Scandinavia

## Scale:

Individual tree level growth

## Other:

Ground truthing still essential

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So what does this mean for my research?



# Aims & Originality

## Aims:

- i. Quantify growth rates using multi-temporal (2003, 2006) airborne LiDAR data from Kielder Forest;
- ii. Verify by ground truthing and;
- iii. Test the accuracy of the ground truth equipment.

## Originality:

Combination of...

- i. Stand level growth
- ii. Temperate, fast growing forest
- iii. Ground truth error

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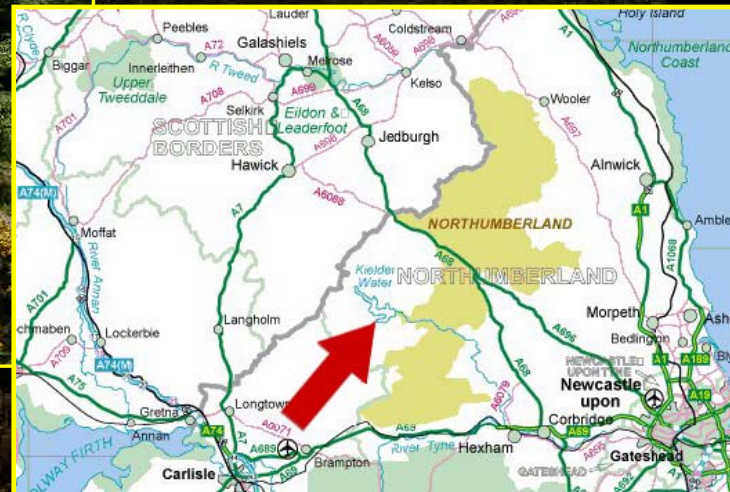
# Field Location

## Kielder Forest, Northumberland

- Forestry Commission
- Plantation Forest: 62,000 ha
- Sitka Spruce



Source: [www.hadrianswallcountry.org](http://www.hadrianswallcountry.org)



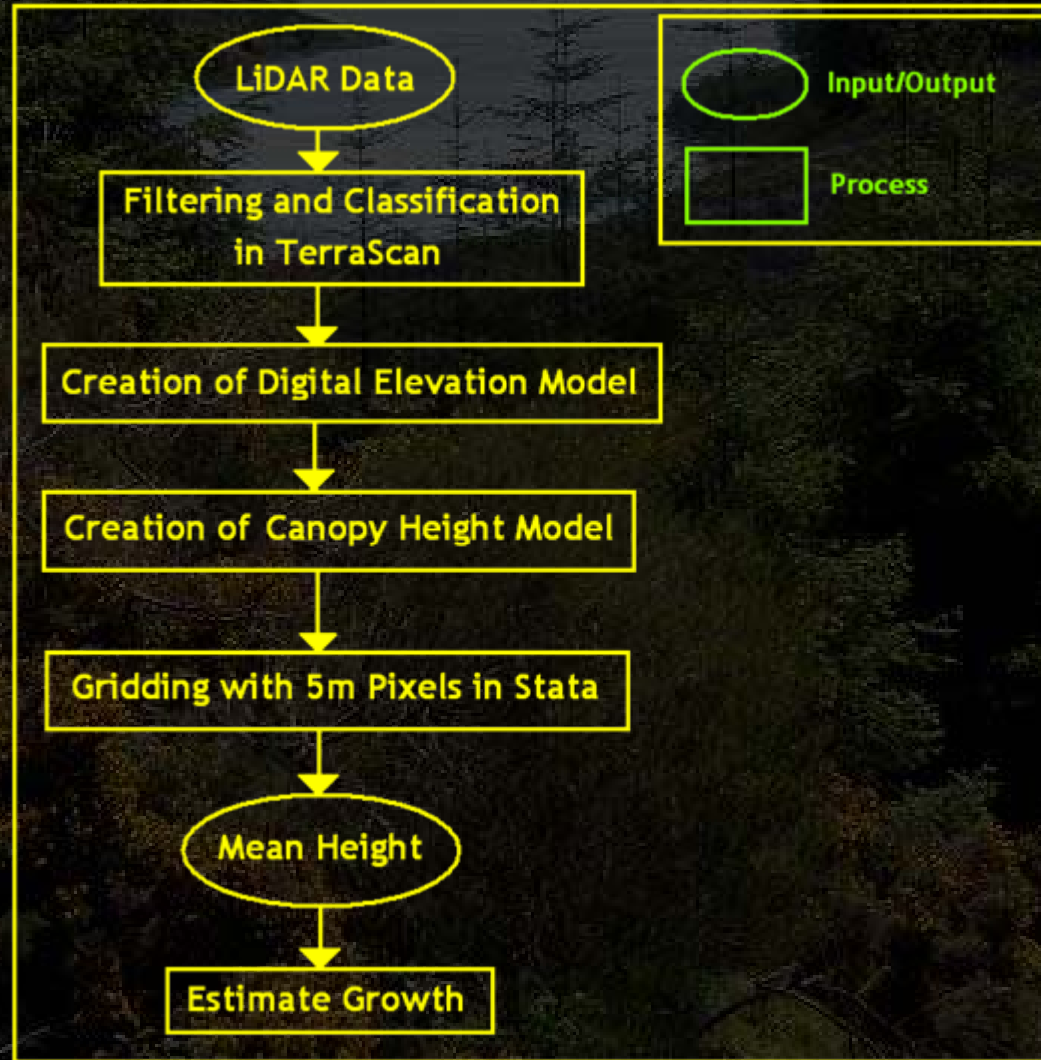
Source: [www.calvert-trust.org.uk](http://www.calvert-trust.org.uk)

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# LiDAR Processing

## Methodology



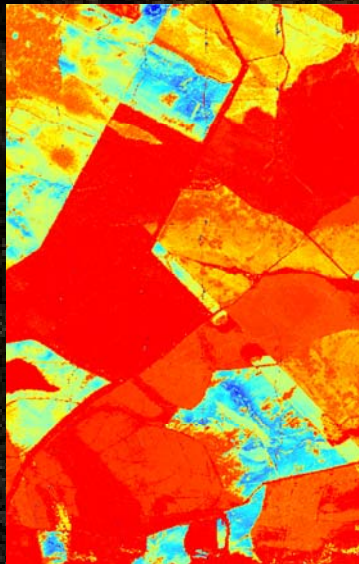
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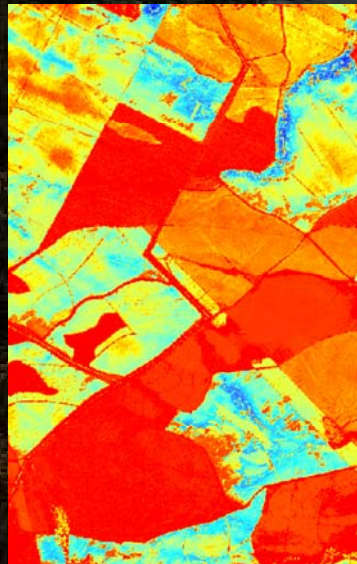
# LiDAR Processing

*Estimating Growth...*

Mean Height Data



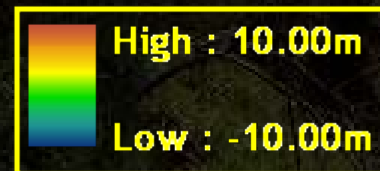
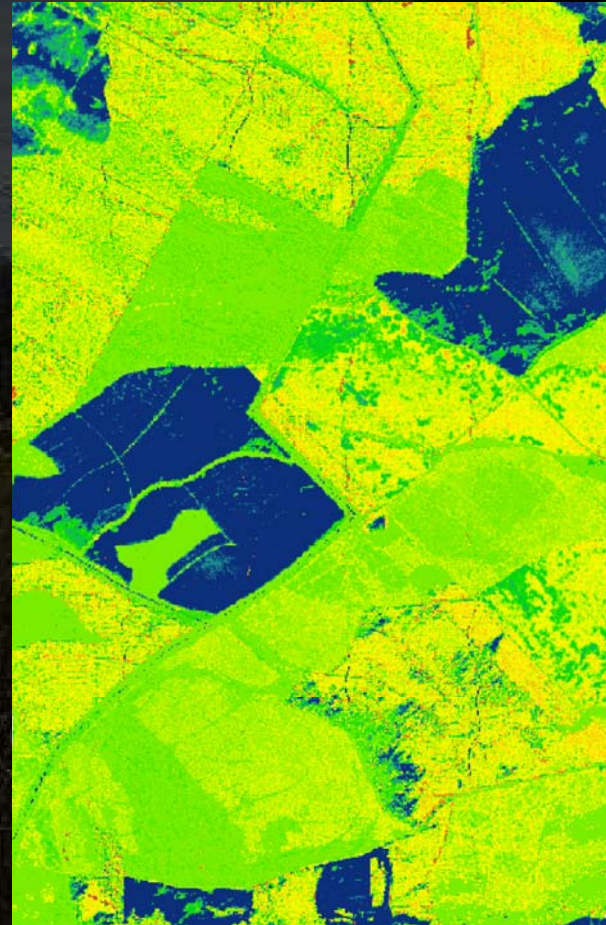
2006



2003



Growth



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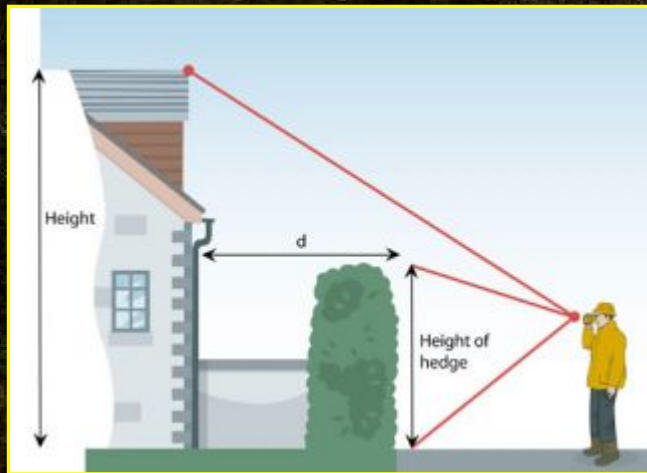




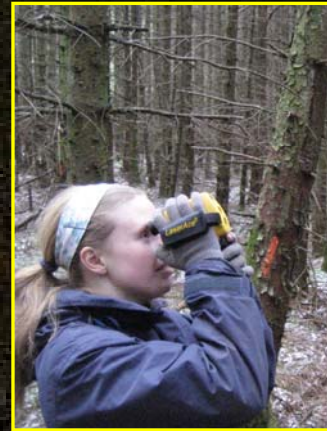
# Ground Truthing

## *Verification of LiDAR*

- Using a Vertex Hypsometer
- 0.02ha circular plots
- Various ages
- Height, dbh etc.



*Use of LaserAce*

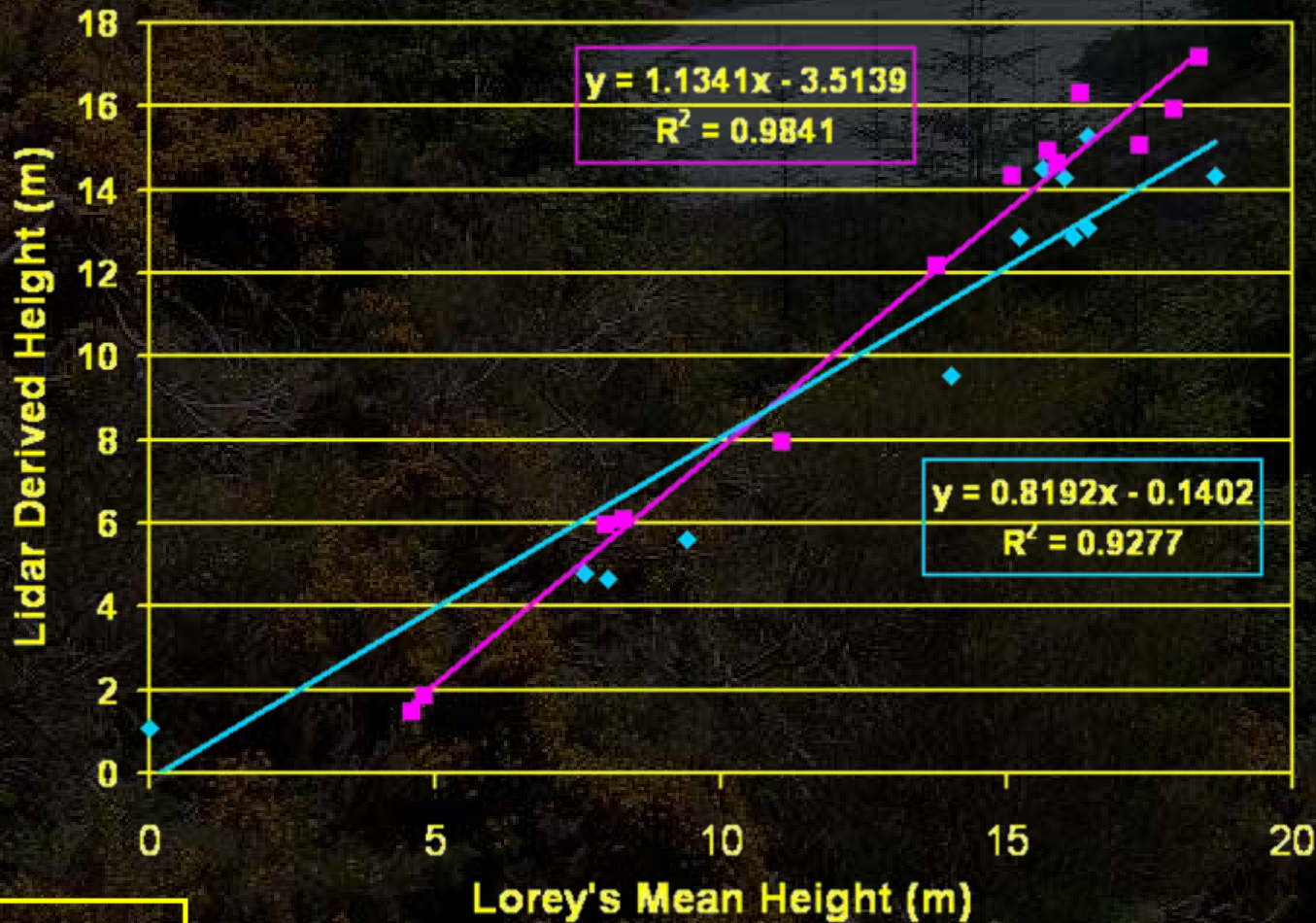


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# Height Regressions

*Comparing the LiDAR with the Ground Truth Data*

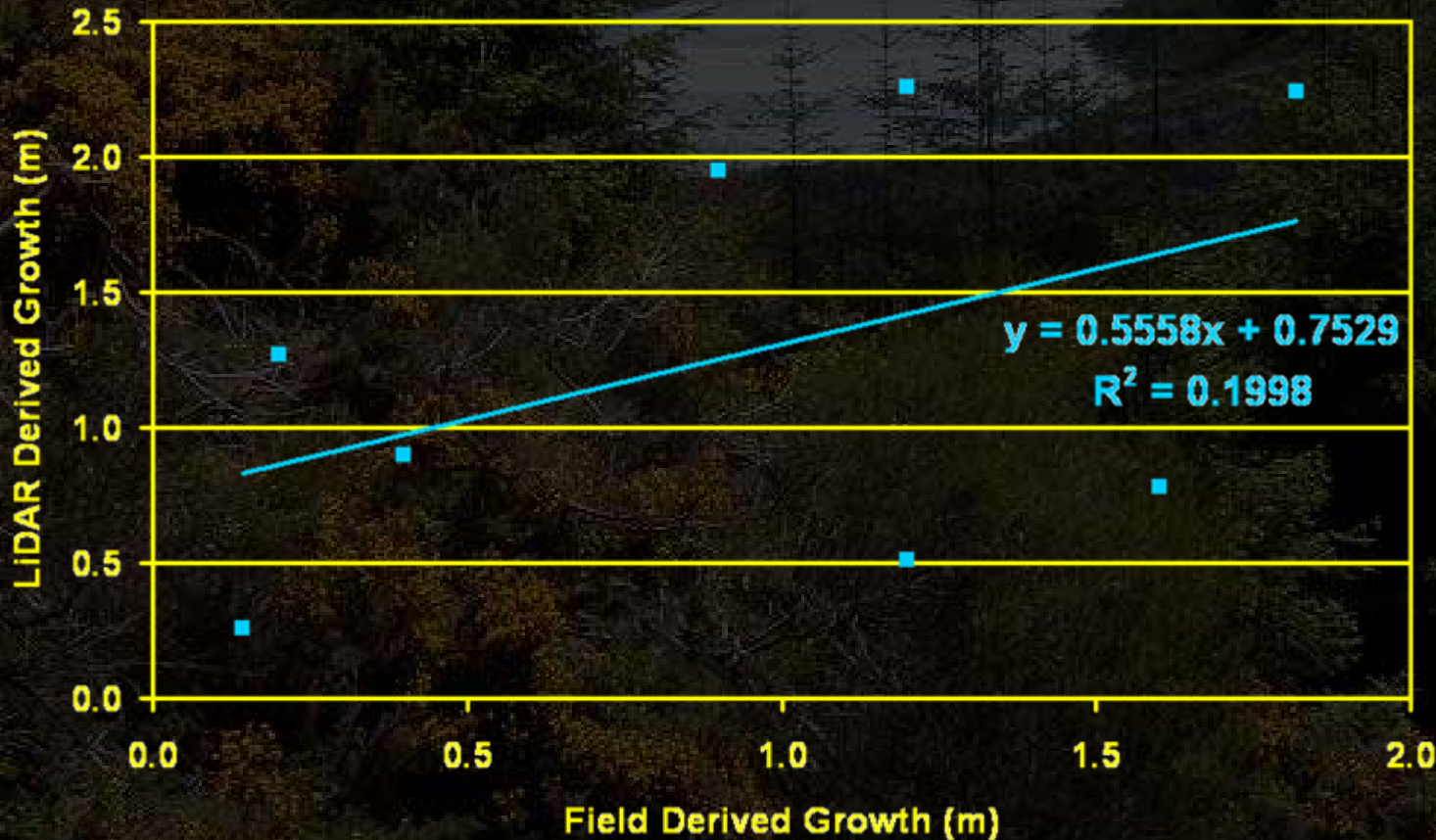


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# Growth Regressions

*Comparing the LiDAR with the Ground Truth Data*



- Weak correlation, despite removal of all negative values

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# Ground Truth Error?

- Errors are expected within the LiDAR
- Ground truth data is assumed to be 'true'
- But what is the error associated with ground truth data collection?
  - Instrument accuracy?
  - User variability?

## The Trial

- 15 trees AND 9 users
- 3 height measuring devices
  1. Vertex Hypsometer
  2. Suunto Clinometer
  3. LaserAce



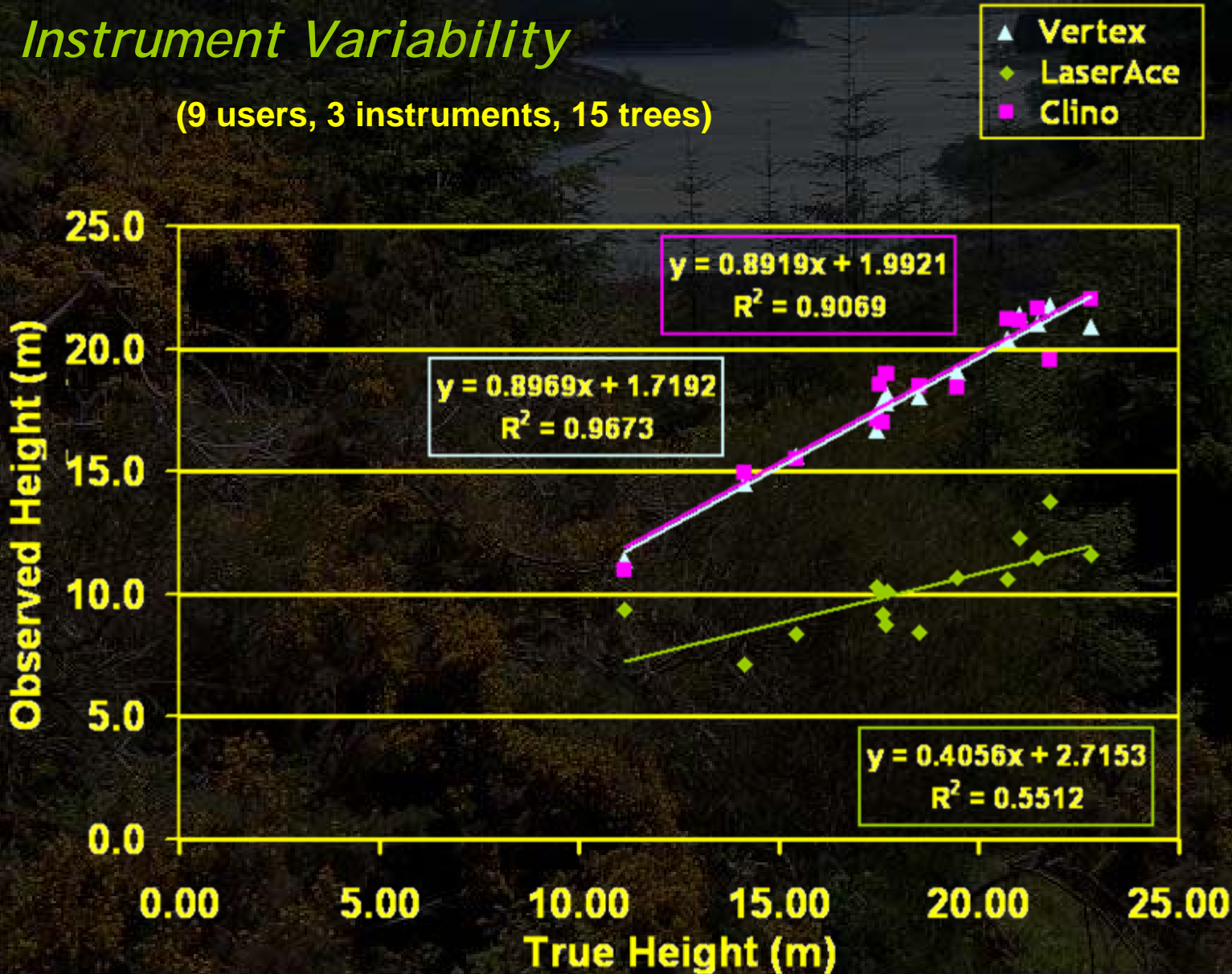
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# Ground Truth Error

## *Instrument Variability*

(9 users, 3 instruments, 15 trees)



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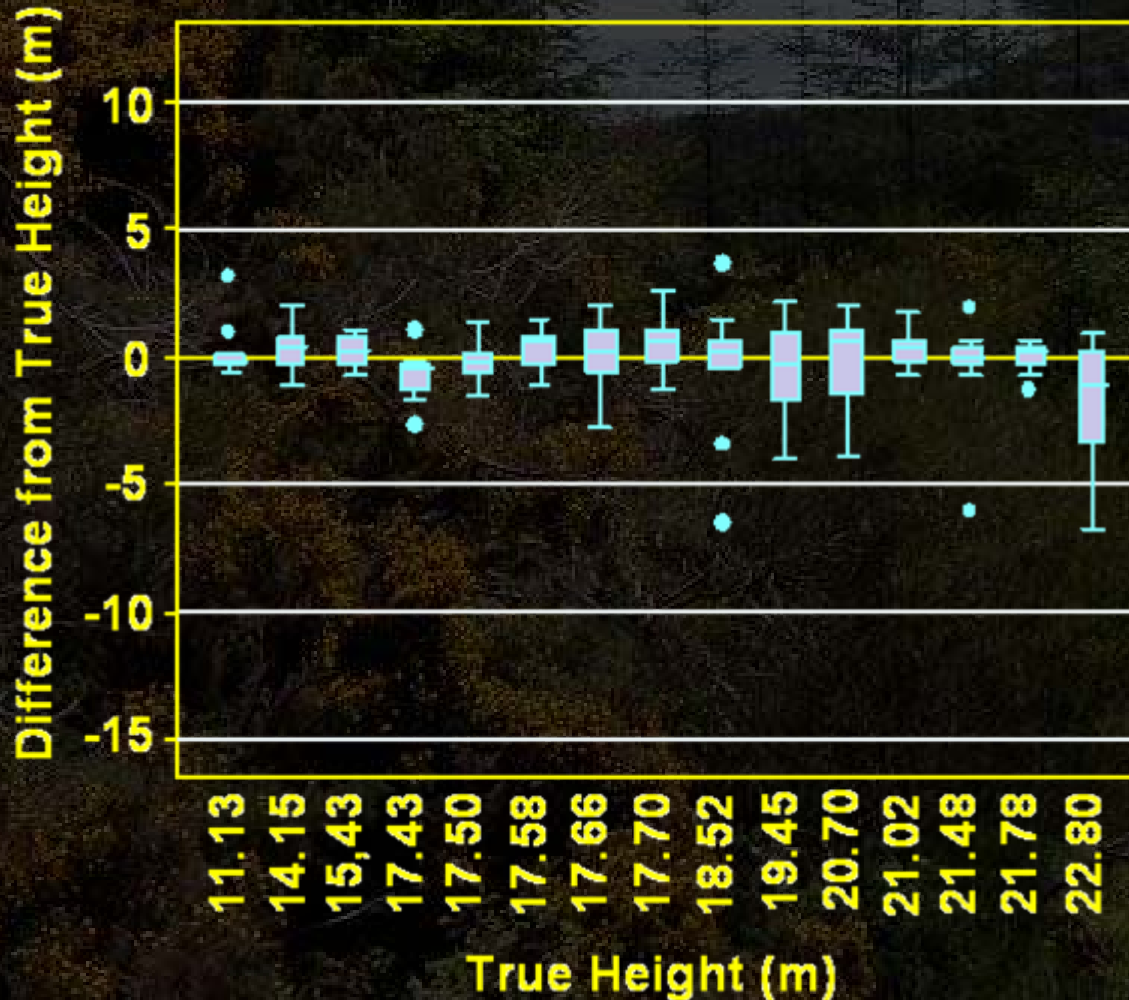
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# Ground Truth Error

## *Instrument and User Variability*

The Vertex...



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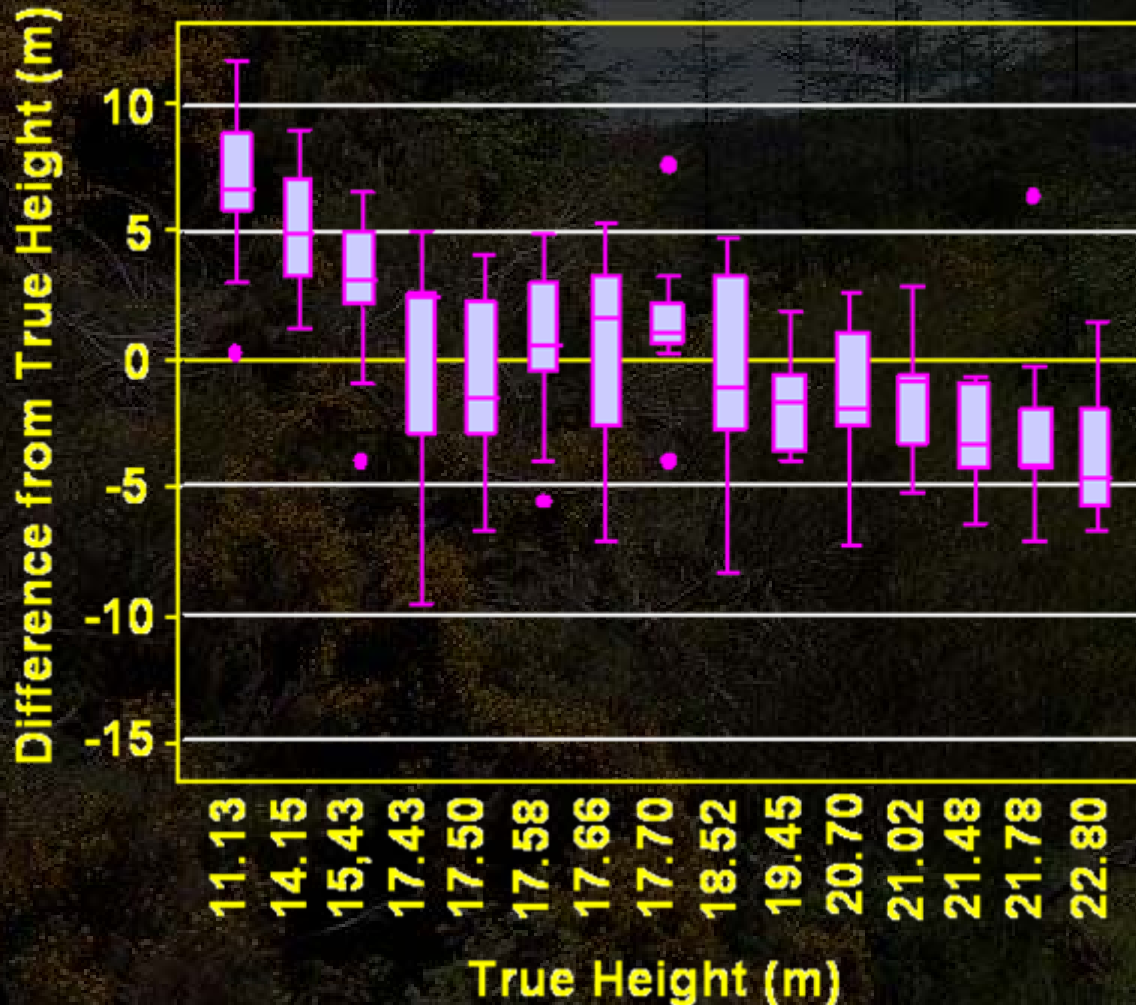
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# Ground Truth Error

## *Instrument and User Variability*

The Suunto Clinometer...



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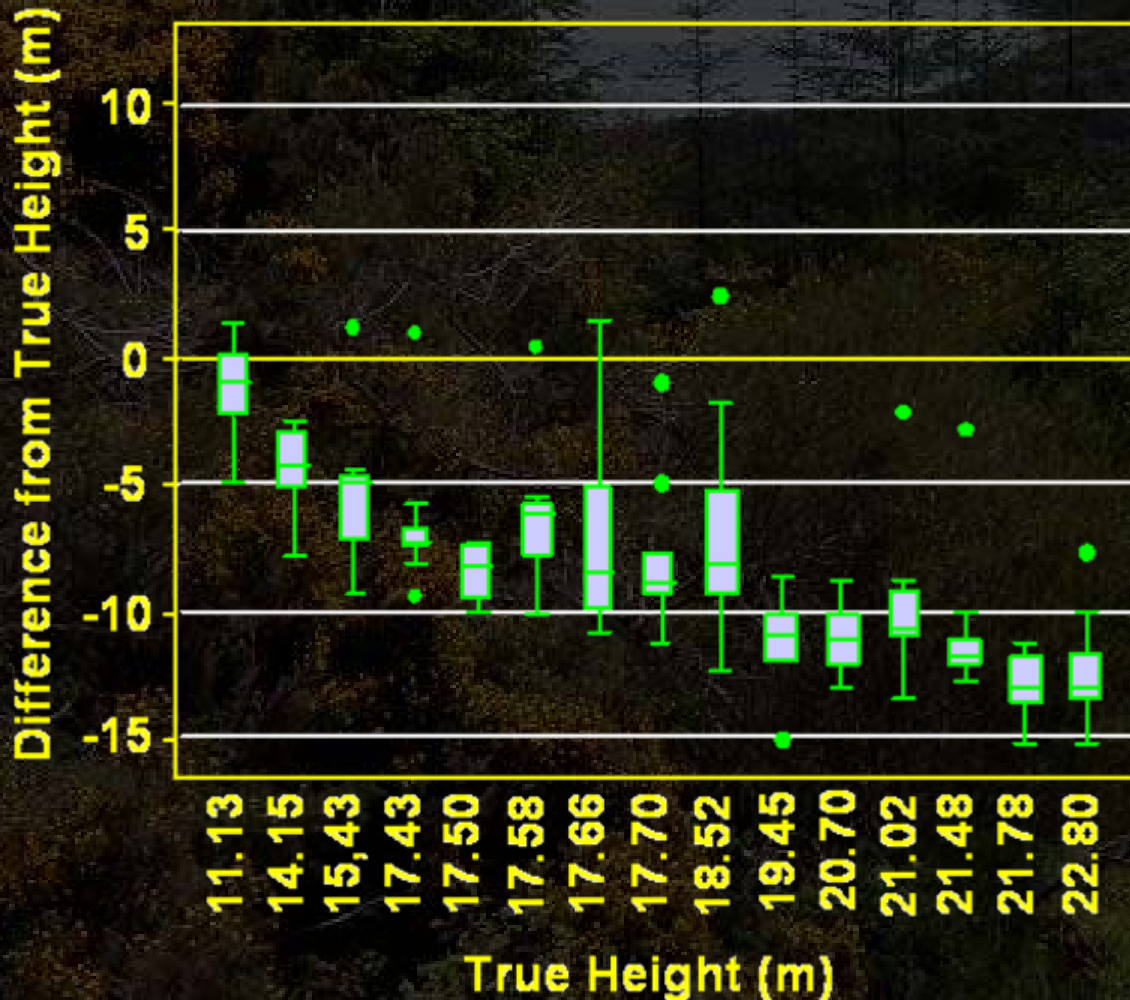
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# Ground Truth Error

*Instrument and User Variability*

The LaserAce...



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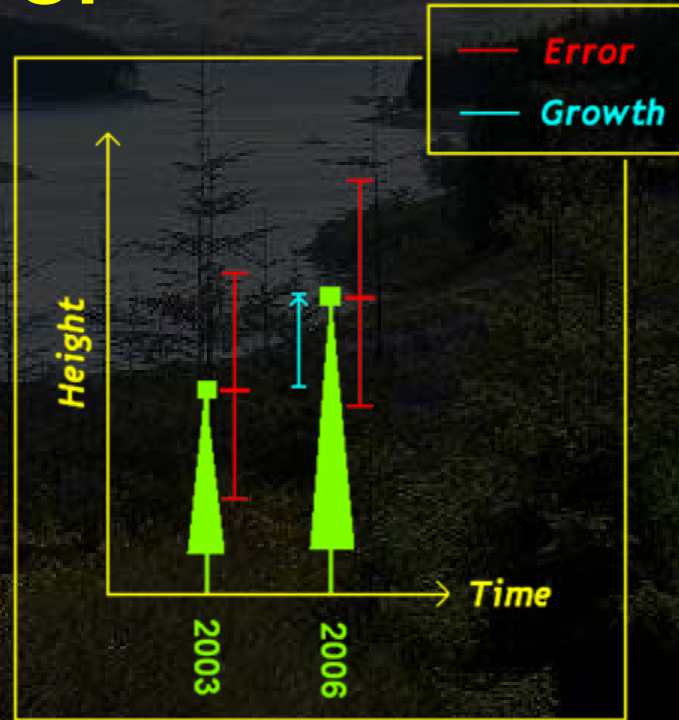




# Ground Truth Error

## Summary...

- Vertex seems most accurate
  - Strong positive correlations with 'true' height ( $R^2=0.97$ )
- BUT- scatter is still considerable
  - As much as 2m
- Growth over the 3 years is small
  - 0.2 - 1.8m
- Therefore growth is undetectable?



Errors associated with growth estimation are actually larger than the estimated growth itself (with respect to the ground truthing)

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# Conclusion & Future Work

Original Aim: growth at Kielder using ALS 2003-2006

## Findings:

- Strong positive correlations for HEIGHT ( $R^2 = 0.98$ )
- Poor correlations for GROWTH ( $R^2 = 0.2$ )
- Significant errors in Vertex data (2m)
- Causes any growth to be undetected

What does this ground truth error mean for estimating growth using LiDAR?

Need to understand errors and biases in order to develop a repeatable, robust methodology

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