# **Exploring the innovation potential of single photon lidar for Ontario's eFRI** *KTTD 5B-2018*



## Dr. Joanne White

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# **Collaboration and partnerships**

### *Co-leads: Joanne White (CFS), Murray Woods (OMNRF, CWFC), Jordan McMillan (CIF)*

### **Funding:**

*Forestry Futures Trust; Canadian Institute of Forestry (CIF); Canadian Wood Fibre Centre, Canadian Forest Service Canada Centre for Mapping and Earth Observation (CCMEO); Canadian Nuclear Laboratories (CNL) OMNRF funded the RTK survey* 



### **Collaborators and contributors:**

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# **Project objectives**

- 1. Quantify the performance of single photon lidar (SPL) in an area-based approach to estimating forest inventory attributes;
- 2. Quantify the performance of SPL for characterizing the terrain surface under varying forest types and canopy densities.

### **Timeline Airborne Laser Scanning**



Source: G. Mandleburger KTTD 5B-2018



SPL starts at 6 million pulses per second

LML: 20 years to get from 10,000 pulses per second to 1 million pulses per second

## **Single Photon Lidar: Acquisition capacity**

- Wästlund et al. 2018 (Sweden):
	- $-$  SPL covered 590 km²/hour, LML covered 50 km²/hour ()
- Mandleburger et al. 2019 (Austria):
	- Swath width for SPL was >2x greater that of LML, altitude was 5x greater
- Yu et al. 2020 (Finland):
	- SPL required 1/5<sup>th</sup> the number of flight lines required by LML

## **Single Photon Lidar: Acquisition capacity**

## *Enables lidar acquisitions over very large areas with consistent parameters*









## **LML versus SPL** Low frequency

**LML (Linear-Mode Lidar)** 

- 3D points clouds with low range noise (high precision)
- NIR wavelength (e.g. 1064 nm)
- Acquisition = low and slow
- Multiple returns for a single pulse
- Many photons to register a return = Multi-Photon Lidar (MPL)

## **SPL (Single Photon Lidar)**

- High density 3D point clouds with high range noise (lower precision)
- Green wavelength (532 nm)
	- Greater sensitivity to background solar noise
	- Leaf reflectance is much reduced compared to NIR
- Acquisition = higher and faster
- Single photons = return = SPL











# **Study area: PRF and CNL**

**Age Class Distribution**



# **Project objectives**

1. Quantify the performance of single photon lidar (SPL) in an area-based approach to estimating forest inventory attributes;

2. Quantify the performance of SPL for characterizing terrain surface under varying forest types and canopy densities.

# **Assessing single photon lidar for enhanced forest inventory in diverse mixedwood forests**

Joanne White<sup>1</sup>, Margaret Penner<sup>2</sup>, Murray Woods<sup>3</sup>

<sup>1</sup>Canadian Forest Service (Pacific Forestry Centre), Natural Resources Canada <sup>2</sup>Forest Analysis Ltd.

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## **Research objectives (inventory)**

- Assess the application of SPL data in an area-based approach to forest inventory in a temperate forest environment with a multitude of tree species and complex forest management histories;
- Determine how estimation accuracy varied by forest type using independent intensively sampled, stand-level validation data.

# **Study area: SPL data**

- Acquired: July 1, 2018
- Sensor: Leica SPL100
- Altitude: 3800 m
- ANPD: 32.8 points/m<sup>2</sup>





## **Calibration data**

- 269 (249 PRF + 20 CNL) calibration plots
- Fixed-area plots
- 14.1m radius (625 m<sup>2</sup>) (25 x 25m raster)
- Structurally-guided sampling
- Species, dbh, status, heights > 9cm
- Sub-sampled for trees 2.5cm-9cm
- Sub-metre GPS positioning





## **Validation data**

- Independent, intensively sampled
- 27 stands cruised on a 50 m grid in spring 2019
- 10 forest types





# **Target forest inventory attributes**

### **Height**

- Dominant/codominant height
- Top height
- Lorey's height  $\geq 2.5$  cm and  $\geq 9.1$  cm<sup>\*</sup>

### **Average tree size**

• Quadratic mean DBH ≥ 2.5 cm and ≥ 9.1 cm

### **Density**

- Basal area  $\geq 2.5$  cm and  $\geq 9.1$  cm<sup>\*</sup>
- Stems per ha  $\geq 2.5$  cm<sup>\*</sup> and  $\geq 9.1$  cm<sup>\*</sup>

### **Volumes**

- Gross total volume ≥ 2.5 cm (TVOL)
- Gross total volume  $\geq 9.1$  cm (TVOL merch)<sup>\*</sup>
- Merchantable stem volume ≥ 9.1 cm (MVOL)\*
- Total aboveground biomass  $\geq 2.5$  cm and  $\geq 9.1$  cm<sup>\*</sup>

### **Ratios<sup>1</sup>**

- VBAR\_TVOL\_ratio = VBAR\_TVOL\_merch/VBAR\_TVOL
- VBAR\_MVOL ratio = VBAR\_MVOL/VBAR\_TVOL\_merch
- BA\_merch\_ratio = BA\_merch/BA\_all
- HL\_merch\_ratio = HL\_merch/HL\_all
- Bio\_merch\_ratio = BIO\_merch/BIO\_all

### **Management size class**

- 4 size classes: poles, small, medium, large
- BA, QMD, TVOL\_merch, MVOL, Biomass, VBAR, TPH

\*Derived from other predicted attributes <sup>1</sup>Used to ensure logical estimates *No forest type information used in modeling* 





Stand GMV m<sub>3</sub> hal 101.  $451.5$ 551 - 600

Raster predictions providing fine-scale resolution of landscape variation

Mean stand polygon representation of raster predictions **KTTD 5B-2018** 







# 2012-LML Validation **EFI outcomes: 2012 LML vs 2018 SPL**

### **2012 Validation:**

- 17 stands cruised on a 50m grid in 2015
- No sampling stratification Stands were selected to meet operational requirements for planned harvesting activities
- Unbalanced sample by forest type (5 types sampled)



### 2008-Selection **2018 Validation:**

- w**io vai**n<br>O<sup>17 cton</sub></sup> • 27 stands cruised on a 50m grid in spring 2019 (0 years post LiDAR acquisition)
- 10 forest types x 3 stands identified. Post-cruising species information realigned sampling by forest types





## **EFI outcomes: 2012 LML vs 2018 SPL**

**Accuracy**





**Bias**

■ 2012 2018

## **EFI outcomes: Comparisons to other studies**



## **EFI outcomes: Comparisons to other studies**



# Summary (inventory)

- Overview of plot distribution • Area-based models developed using SPL data produced accurate inventory attribute estimates with minimal bias
- Accuracy of attribute estimates are on par with those generated using LML
- Accuracy varies by forest type, with greatest overestimation for managed white pine stands and the greatest underestimation for red pine plantations
- Accuracy for boreal forest types (jack pine, black spruce) similar to those reported in other studies



Assessing single photon lidar for operational White, J.C., Penner, M., Woods, M. 2021. implementation of an enhanced forest inventory in diverse mixedwood forests. *The Forestry Chronicle*. IN PRESS

### Open Access



#### Assessing single photon LiDAR for operational implementation of an enhanced forest inventory in diverse mixedwood forests

by Joanne C. White<sup>11</sup>, Margaret Penner<sup>2</sup> and Murray Woods<sup>2</sup>

#### **ABSTRACT**

Airborne laser scanning (ALS: LiDAR) data are an increasingly common data source for forest inventories, and approaches integrating ALS data with field plot measurements have become operational in several jurisdictions. As rechnology continues to evolve, different LiDAR sensors can provide new opportunities to incorporate LiDAR data into forest inventory workflows. Single photon LiDAR (SPL) enables efficient, large area data acquisition and merits further investigation for forest inventory applications. Herein, we investigated the capacity of leaf-on SPL data, combined with 269 field plots, for estimating forest inventory attributes in the Great Lakes-St. Lawrence mixedwood forests of southern Ontario, Canada. Inventory attribute estimates were validated at the stand level using independent reference data acquired for 27 intensively sampled stands. Top height, Lorey's height, gross total volume for merchantable stems, merchantable stem volume, basal area, quadratic mean diameter, and total aboveground biomass were estimated with a relative RMSE of 13.52%, 7.24%. 14.61%, 16.27%, 14.42%. 12.25%, and 11.72%, respectively. Relative bias was < 1% for all attributes except top height (10.34%), merchantable volume (3.37%), and basal area (1.68%). Accuracy and bias varied by forest type and stand-level validation was important for assessing model performance in different stand conditions. SPL data can be used to generate accurate, area-based forest inventories in mixedwood forests that have a multitude of tree species and complex forest management histories.

Keywords: enhanced forest inventory. LiDAR, temperate forest, ALS, SPL, EFL PRF

RESUME IN TRANSLATION.

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# **Project objectives**

- 1. Quantify the performance of single photon lidar (SPL) in an area-based approach to estimating forest inventory attributes;
- 2. Quantify the performance of SPL for characterizing terrain surface under varying forest types and canopy densities.

# **Evaluating the capacity of single photon lidar for terrain characterization under vegetation canopy**

## Joanne White<sup>1</sup>, Murray Woods<sup>2</sup>, Thomas Krahn<sup>3</sup>, Charles Papasodoro<sup>4</sup>, David Bélanger<sup>4</sup>, Craig Onafrychuk<sup>3</sup>, lan Sinclair<sup>5</sup>

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## **Research objectives (terrain)**

- 1. Quantify the vertical accuracy and precision of SPL data (leafon and leaf-off) for characterizing terrain surface elevations under a range of forest conditions and acquisition altitudes (3800 m versus 2000 m)
- 2. Evaluate derived DEMs



## **Lidar data**



## **Lidar data**





### 2012 LML by return













2018 SPL by return



## **Reference data for terrain evaluation**

- Real-Time Kinematic (RTK) survey
- 299 checkpoints in a range of cover types





## **Results (checkpoints)** *(Lidar z – Reference z)*



## **Results (checkpoints)**

• Do we see the same error, of the same magnitude and direction (positive or negative), at the same location?



### **RMSE (cm)**

### **Mean Error (cm)**



### **Error Standard Deviation (cm)**

### **95th Percentile (cm)**



### **th Percentile (cm)**











## **Results (wall-to-wall DEM comparison)**

#### **2012 - 2018**



**2012 - 2019H**



**2012 - 2019L**



1 m DEMs Red = SPL overestimates Black = SPL underestimates

Percentage of pixels within ± 30 cm: 96% Percentage of pixels within ± 50 cm: 99%







2012 LML

2018 SPL Leaf-on

2019 SPL Leaf-off



**RMSD for DEM differences, by cover type**

2018 2019H 2019L

**RMSD for DEM differences, by canopy cover**



### **RMSD for DEM differences, by vertical complexity class**



### **RMSD for DEM differences, by slope class**



## Summary (terrain) 1/3

- Leaf-off SPL data was more accurate than leaf-on SPL data and 2012 LML data for terrain capture under vegetation
- Leaf-off SPL data acquired at lower altitude was more accurate than leaf-off SPL acquired at higher altitude
- Leaf-off data reduced RMSE by 17% (2019H SPL vs 2018 SPL)
- Lower altitude reduced RMSE by only 8% (2019L SPL vs 2019H)



## Summary (terrain) 2/3

- No consistent trends between canopy cover and the accuracy of terrain capture
- Vegetation density, composition, and configuration influences accuracy of terrain capture
- Differences in lidar characteristic do result in differences in derived DEMs



## Summary (terrain) 3/3

• Under vegetation cover, leaf-on SPL data is less accurate and less precise than either leaf-off SPL or LML, but accuracy is within requirements for CQL1 products



White, J.C., Woods, M., Krahn, T., Papasodoro, C., Bélanger, D., Onafrychuk, C., Sinclair, I. 2021. Evaluating the capacity of single photon lidar for terrain characterization under a range of forest conditions. *Remote Sensing of Environment*, 252, 112169. DOI: 10.1016/j.rse.2020.112169

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#### Evaluating the capacity of single photon lidar for terrain characterization under a range of forest conditions

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ABSTRACT



'n

Accurate digital elevation models are key data products used to inform forest management. Light detection and ranging (lidar) technologies have emerged as a useful tool for acquiring detailed terrain information, although the accuracy of this data is known to vary with topographic complexity and the density and characteristics of overlying vegetation. Single Photon Lidar (SPL) provides a high-density point cloud that can be acquired from a much higher altitude than discrete return, small-footprint lidar (hereafter, linear-mode lidar or LML), providing efficiencies and potential cost savings for operational mapping programs. Herein, we assess the absolute and relative accuracies of leaf-on and leaf-off SPL data acquired at different altitudes for characterizing terrain under varying vegetation types and densities and compare to results for LML data. Our assessment was forest-focused and primarily point based, using 299 Real-Time Kinematic survey checkpoints to quantify elevation errors  $(\Delta h)$ : however, we also investigated and reported accuracy for linear transects, and conducted a wall-to-wall comparison of the SPL-derived 1-m digital elevation models (DEMs) against an LML-derived DEM. Point cloud characteristics for the leaf-on 2018 SPL data were markedly different, with 88% of returns as first returns. compared to 17% for the LML, and 59% and 46% for the leaf-off SPL data acquired at 3800 m and 2000 m. respectively. Of the datasets considered herein, the SPL data acquired under leaf-on conditions in 2018 had the lowest accuracy and precision for characterizing termin underneath vegetation cover, with an RMSE of 10.97 cm and a 95th quantile of 24.03 cm; however these values are within commonly accepted error limits for elevation products. The leaf-off SPL data were most accurate overall; however, the differences between the leaf-off SPL data acquired at 3800 m versus 2000 m were often minor  $(-1 \text{ cm})$  on average), with similar patterns in Al between the two datasets  $(r = 0.8)$ . In terms of the relative performance of the lidar datasets examined, results from the analyses of linear transects were similar to those of the checkpoints, but highlighted the variability in elevation accuracy within similar cover types. Wall to wall comparisons of the SPL-derived DEMs to the 2012 LML DEM also corroborated the results of the checkpoint assessment, with the 2018 SPL leaf-on DEM having the largest differences (mean difference = 7.44 cm; RMSD = 18.07 cm). Differences between DEMs did not trend consistently with increasing canopy cover or with the percentage of returns that were within  $\pm 15$  cm of the ground surface. We found that it was not only the density of the vegetation, but also the composition and configuration of both the overstory and understory vegetation that influenced the accuracy with which the lidar characterized the terrain surface. Overall, our results indicated that leaf-on SPL is capable of capturing terrain information under a wide variety of forest and vegetation conditions, albeit at a lower accuracy than what is possible with leaf-on LML or leaf-off SPL, but at a level of accuracy that is within acceptable limits for most forest applications.

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# Key project takeaways:

- SPL area-based attribute predictions are on par with those attained using LML data in the same forest types, and those using SPL data in different forest environment;
- Leaf-on SPL data acquired at 3800 m agl provides terrain accuracies that are within the accuracy requirements for vegetated cover;
- This project enabled novel insights that are of both scientific and operational value;
- Collaborations and partnerships were critical for success;
- Open and transparent science and data are key to innovation in the forest sector…



## **Petawawa Research Forest: Remote Sensing Supersite**

SPL: https://opendata.nfis.org/downloads/petawawa/Raster/LiDAR\_2018/PRF\_LiDAR2018\_LAS.zip





# Thank you!

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> Joanne White, Research Scientist Canadian Forest Service

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