# LIDAR and Photogrammetry to Map Alfalfa Yield and Quality Using Unmanned Aircraft Systems

Joseph Dvorak<sup>a</sup>, Luis Pampolini<sup>a</sup>, Ben Goff<sup>b</sup>, Joshua Jackson<sup>a</sup>, Michael Sama<sup>a</sup>

<sup>a</sup> Department of Biosystems and Agricultural Engineering, University of Kentucky, Lexington, Kentucky, USA <sup>b</sup> Department of Plant and Soil Sciences, University of Kentucky, Lexington, Kentucky, USA,

### LONG-TERM VISION

The long-term vision is to provide producers with whole field estimates of crop state to aid crop and machinery management decisions.

#### **PROJECT ABSTRACT**

The goal of this project is to enable alfalfa producers to map yield and quality (or more precisely nutritive value) across an alfalfa field using an Unmanned Aircraft System (UAS) at sufficient resolution to enable identification of the yield damage caused by wheel traffic. Alfalfa production has always involved tradeoffs between yield and nutritive value, and these tradeoffs have only become more complicated with the introduction of reduced lignin varieties. With field-wide maps, producers would be able to more accurately determine the quantity of forage that the field would produce and make decisions on whether waiting for more yield warranted the reduction in nutritive value from current levels. They would also be able to recognize the consequences of machinery management decisions on yield reduction from wheel traffic and better optimize their machinery use. Both yield and nutritive value are correlated with the physical structure of alfalfa plants and both LIDAR and photogrammetry, which are sensor systems that can identify this three-dimensional structure, will be tested in this project. Initial calibration tests will be performed weekly in the first season, and verification tests will occur once per cutting in years two and three and at additional locations in Georgia and Pennsylvania to ensure robustness of results. The basic testing procedure will consist of a flight to record sensor outputs and 1 meter-squared quadrat sampling to provide actual dry plant matter yield and nutritive value. The results of this project will be shared with producers and crop consultants through Extension events.

# Yield

- The amount of biomass in a forage crop is highly correlated with sward surface height [1-5], but height alone can produce significant error [6, 7].
- However, stand density is also critical [8, 9].
- Yield prediction is more reliable with methods that rely on plant material density (rising plate meter, Robel pole) [10].

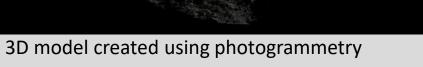
## BACKGROUND

Nutritive Value – Height Based

- Laboratory methods are the most reliable benchmark.
- Methods like PEAQ use easily observable height and maturity stage to estimate quality [11].
- The PEAQ results indicate that a height change of only 10 cm is equivalent in nutritive value terms to maturity advancing from the Late Vegetative Stage all the way to Flower Stage [12].

# Photogrammetry

 Stitches many 2D images to create 3D models of surfaces









North American Alfalfa

Reduced Lignin Varieties

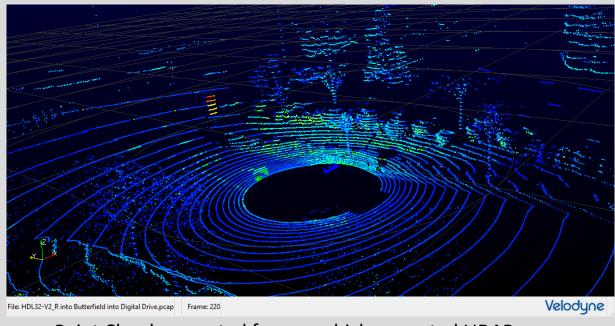
- Plants use lignin to support plant height, but reduced lignin varieties have lower amounts of lignin and higher nutritive value at given stage of development [18, 19].
- Does this lower lignin level affect the nutritive value/height relationship?
- A second equation based only on height also performed well, if not with the same accuracy level as PEAQ [13].

# Nutritive Value – Yield Based

• The rate of growth in forage yield decreases as plant maturity increases and nutritive value decreases [14-17]

LIDAR

Light Detection And Ranging
Creates a point cloud representation of scanned objects



Point Cloud generated from a vehicle mounted LIDAR

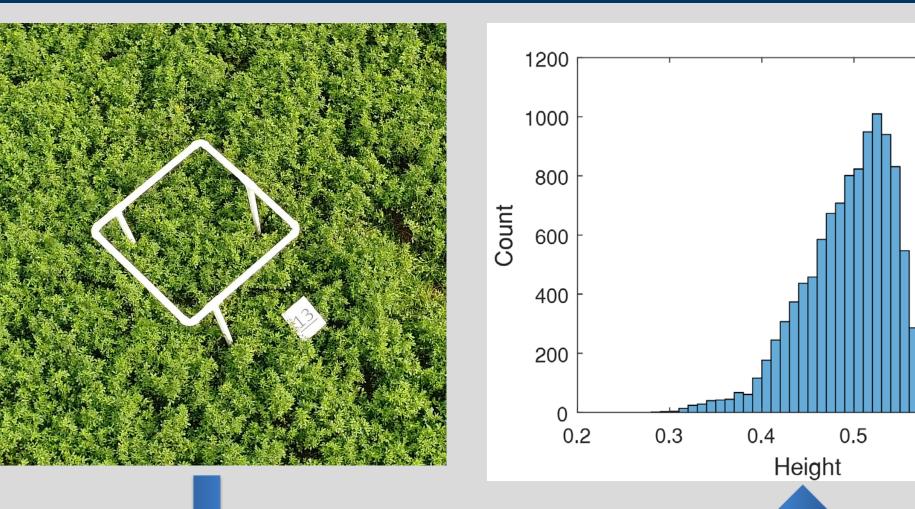
## **CURRENT WORK**

# **Current Efforts**

- Sample weekly with 20 quadrats all growing season
- Last year all photogrammetry
- Focus on sampling quadrats
- Establish optimal performance
- Focus on processing using local and immediate data and statistical distributions of the point cloud
- Compared to Global Processing: Generating a field-wide point cloud or surface mesh of plant canopy and comparing with a point cloud or surface mesh of the bare ground.







#### PHOTOGRAMMETRY PROCESSING EXAMPLE

Sample	F5T13
Location	КҮ
Date	July 11, 2018
Cutting	3rd
Yield (kg/ha)	4130
NDF (%DM)	38.35
ADF (%DM)	28.40
CP (%DM)	16.18
Weed (1-5)	< 5%
Disease (1-5)	< 5%
Insect (1-5)	< 5%
Man. Max Canopy Height (cm)	68
Man. Ave. Canopy Height (cm)	55
Maturity	4: Late Bud
Stand Density	54
Photo. Max Canopy Height (cm)	64
Photo. Ave. Canopy Height (cm)	50
Photo. Min Canopy Height (cm)	29
Points within Quadrat	10905

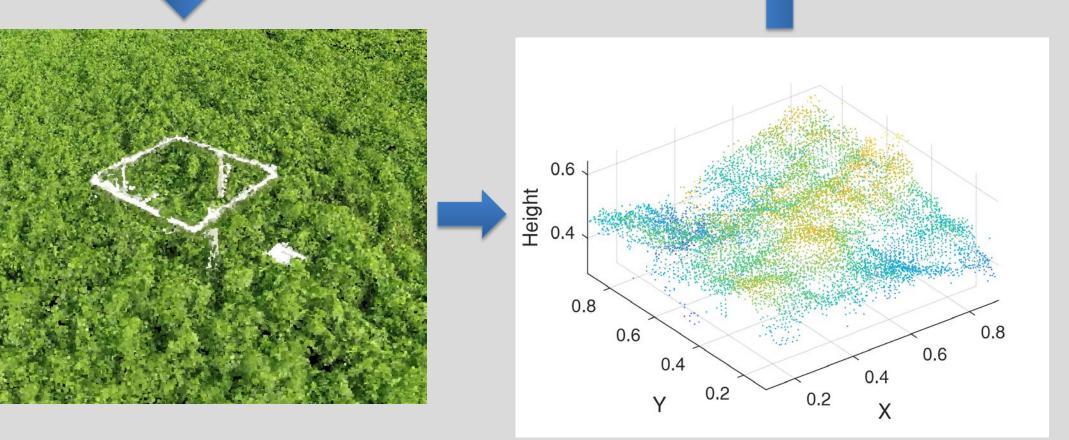
# Coming up:

- Test different field scanning methods
- Fly the LIDAR system
- Tests in areas with wheeled traffic damage machinery management
- Tests in reduced lignin varieties
- Does PEAQ work in reduced lignin?
- Comparisons with PA, GA, and across cuttings



#### ACKNOWLEDGEMENTS

This work is supported by the Alfalfa and Forage Research Program grant no. 12143028 / project accession no. 1010223 from the USDA National Institute of Food and Agriculture.



#### REFERENCES

- Ganguli, A.C., et al., Comparison of Four Nondestructive Techniques for Estimating Standing Crop in Shortgrass Plains Agronomy Journal, 2000. 92(6).
- Vermeire, L.T., C.G. Amy, and R.L. Gillen, A Robust Model for Estimating Standing Crop across Vegetation Types. Journal of Range Management, 2002. 55(5): p. 494-497.
- Radtke, P.J., H.T. Boland, and G. Scaglia, An evaluation of overhead laser scanning to estimate herbage removals in pasture quadrats. Agricultural and Forest Meteorology, 2010. 150(12): p. 1523-1528.
- Fricke, T., F. Richter, and M. Wachendorf, Assessment of forage mass from grassland swards by height measurement using an ultrasonic sensor. Computers and Electronics in Agriculture, 2011. 79(2): p. 142-152.
- Moyer, J.L. and M.D. Schrock, Automating Measurement of Forage Mass in Pasture. Forage and Grazinglands, 2007. 5(1).
- Fricke, T. and M. Wachendorf, Combining ultrasonic sward height and spectral signatures to assess the biomass of legume–grass swards. Computers and Electronics in Agriculture, 2013. 99(0): p. 236-247.
- Sanderson, M.A., et al., Estimating Forage Mass with a Commercial Capacitance Meter, Rising Plate Meter, and Pasture Ruler. Agronomy Journal, 2001. 93(6).
- Lamb, J.F.S., C.C. Sheaffer, and D.A. Samac, Population Density and Harvest Maturity Effects on Leaf and Stem Yield in Alfalfa. Agronomy Journal, 2003. 95(3): p. 635-641.
- Undersander, D., et al., Alfalfa management guide. 2011, Madison, Wisconsin: American Society of Agronomy
- Harmoney, K.R., et al., *Determination of pasture biomass using four indirect methods*. Agronomy Journal, 1997. **89**(4): p. 665-672.
- I. Hintz, R.W. and K.A. Albrecht, *Prediction of Alfalfa Chemical Composition from Maturity and Plant Morphology*. Crop Science, 1991. **31**(6).
- . Lang, B., Estimate first crop alfalfa quality in the field using PEAQ. 2011, Iowa State University.
- 3. Sulc, R.M., et al., Update on predicting harvest time for alfalfa, in Tri-State Dairy Nutrition Conference on Nutrition and Animal Health, Forages, Feedstuffs, Feeding Management. 1999: Fort Wayne, Indiana.
- 14. Undersander, D., et al., *Alfalfa germination & growth*. 2011, University of Wisconsin-Extension Cooperative Extension: Madison, Wisconsin. p. 18.
- Ball, D.M., et al., *Understanding forage quality*. Vol. Publication 1-01. 2001, Park Ridge, Illinois: American Farm Bureau Federation.
- 6. Undersander, D., Low Lignin Alfalfa for Reducing Labor and Increasing Yield. 2009, University of Wisconsin-Extension: Madison, Wisconsin.
- 17. Mueller, S.C. and L.R. Teuber, Alfalfa Growth and Development, in Irrigated Alfalfa Management for Mediterranean and Desert Zones., C.G. Summers and D.H. Putnam, Editors. 2007, University of California Alfalfa & Forage Systems Workgroup: Davis, California.
- 18. Undersander, D., *Reduced Lignin Alfalfa*. 2015, University of Wisconsin Extension
- 19. Undersander, D., et al. Low lignin alfalfa: Redefining the yield/quality tradeoff. in Western Alfalfa & Forage Conference. 2009