

# Remote estimation of green LAI in maize using UAV-based low-cost imagery

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cont.

Methodology

#### Introduction

- Green leaf area index (gLAI) one of the key parameters in crop growth analysis (Wilhelm et al., 2000).
- Measuring field trial gLAI using in-situ measurements is labor-intensive, costly work with often inaccurate results.
- Unmanned Aerial Vehicle (UAV)-based remote sensing (RS) facilitates estimation due to quick and easy deployment of sensors that are able to cover a number of treatment plots in little time.
- Modified low-cost cameras with sensitivity in the visible and near-infrared (NIR) domain have recently gained the attention of the scientific community.
- Their potential to sense differences in gLAI in maize induced by management factors is largely unexplored.
- We ask: To what extent do broadband vegetation indices based on low-cost imagery cover gLAI temporal dynamics induced by plant density and/or nitrogen

# **Spectral Vegetation Indices Used**

- Three spectral vegetation indices chosen (Table 1)
- •NDVI and GNDVI widely used in RS
- •3BSI was introduced by Verrelst et al. (2015) and outperformed most two-band vegetation indices in parametric LAI regression performance

#### Table 1. Index formulations.



## LAI – SVI Parametric Regression



Crop Science Bonn

# Study Site and Field Experiment

- Study site located at the University of Bonn's agricultural research facility Campus Klein-Altendorf, 15 km southwest of Bonn.
- Field experiment consisted of a combination of two plant densities (50,000 plants (S1) and 100,000 plants (S2) ha<sup>-1</sup>)and two treatments of nitrogen (100 kg (N1) and 200 kg (N2) ha<sup>-1</sup>) (Figure 1)
- Hybrid Panash (AGA Saat AG, Neunkirchen, Germany) used in 2015, hybrid Ricardinio (KWS Saaten AG, Einbeck, Germany) in 2016.
- Destructive green LAI measurements using the LI-COR LI-3100C area meter (LI-COR Inc., Lincoln, NE, USA).
- 32 samples per sampling date, with eight dates in 2015 and ten in 2016.



Figure 1. Experimental setup. Enlargement on the right shows gLAI sampling spots.



**Figure 3.** gLAI - NDVI relationships per management factor. The left column shows

- NDVI models differed for 2015, and resembled for 2016.
- For 2015, no saturation effect could be noticed within the range of measured gLAI values.

**Figure 4.** gLAI – GNDVI relationships per management factor.

Similar to the results above, GNDVI – gLAI models resembled for 2016, and differed for

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#### Camera System and UAV

- We employed two Canon ELPH 110 HS digital compact Red-Green-Blue (RGB) cameras, modified by LDP LLC Inc. (Carlstad NJ, United States).(Figure 2).
- CMOS sensor with 4608 x 3456 recording pixels (i.e. 16.1 Megapixels).
- First camera: Red Green NIR (680-780 nm)
  Second camera: Blue Green NIR (800-900 nm)
- UAV: Mikrokopter OktoXL6S12 (HiSystems GmbH, Moormerland, Germany)
- Flight altitude 50 m, with ground sampling distance of ~1.5 cm
- Multispectral data was collected on mostly cloud-free days immediately before the sampling of the plants.





### 2015.

A clear effect of saturation was noticed in the 2016 data, with gLAI values > 3 not showing an increase in GNDVI values.

**Figure 5.** gLAI – 3BSI relationships per management factor.

- No clear saturation effect could be determined for the 3BSI – gLAI models within the measured range of values
- Contrary to the NDVI and GNDVI models, this applied to both years.

**Figure 2.** UAV and camera setup. Left picture shows the octocopter employed in this study, the right picture the two cameras mounted inside the frame.

# Conclusion

- Spectral data derived from UAV-based modified low-cost cameras delivered a meaningful relationship with measured gLAI values.
- We found differing but definite relationships per treatment factor.
- GNDVI performed slightly better than NDVI; a 3-band combination did not offer any advantages.
- Selected band combinations reached their limits at gLAI values > 3.

- Equal gLAI values did not necessarily result in equal spectral vegetation index values.
- Differences in chlorophyll content might have caused differences in reflectance.

#### References

Verrelst, J., Rivera, J.P., Veroustraete, F., Muñoz-Marí, J., Clevers, J.G.P.W., Camps-Valls, G., Moreno, J., 2015b. Experimental Sentinel-2 LAI estimation using parametric, non-parametric and physical retrieval methods – A comparison. ISPRS Journal of Photogrammetry and Remote Sensing 108, 260–272. Wilhelm, W.W., Ruwe, K., Schlemmer, M.R., 2000. Comparison of three leaf area index meters in a corn canopy. Crop Science 40, 1179–1183.

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