

10% for allocation decisions), and still performed well in terms of other important attributes such as data collection speed, would still be the most useful to farmers as they could use the same device for data across all decision contexts.

## Conclusions

This study provides a first attempt at explicitly defining the important attributes for pasture measurement devices. It provides a guide to the attributes to consider, and some operational performance metrics, for the development of these devices and systems. We engaged with specialists in Australia and Ireland, as well as New Zealand, and while the research was targeted at New Zealand situations, the results can be adapted for guiding technology development and use in other pasture-based dairy systems internationally. Pasture data needs of different end users, such as multi-farm businesses, owner-operators, farm staff, and farm consultants are still to be determined.

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## Optical sensors for variable rate nitrogen application in dairy pastures

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## Abstract

Reducing the amount of nitrogen (N) fertiliser applied to dairy pastures down to agronomically optimised levels would have positive economic and environmental results. The ability of commercially available optical sensors to estimate biomass yield and foliar-N uptake in pastures was investigated. Vegetative indices (Simple Ratio, SR; Water Index, WI; and Normalised Difference Vegetation Index, NDVI) from two active optical reflectance sensors (N-Sensor, Yara; and Greenseeker, Trimble) were compared with manually measured biomass and N-uptake in above-ground foliage. There were three measurements over time, from pastures that had received different N fertiliser applications rates (0, 10, 20, 40 and 80 kg N/ha). It was found that the sensors were able to detect differences in biomass and foliar N-uptake following defoliation of grazed pastures. The tested optical sensors have the potential to inform a real-time variable rate fertiliser application system.

**Keywords:** pasture, nitrogen, optical sensors

## Introduction

Modern intensive dairy farms inherently have low nitrogen use efficiency (NUE) (Powell *et al.* 2010). Lower N-fertiliser application to pastures at a comparable yield level would provide economic benefits to farmers who could spend less money on fertiliser. It could also benefit the environment by reducing the potential for nitrate leaching and nitrous oxide emissions (Maharjan *et al.* 2014). To reduce N-fertiliser application and to determine the optimal rate of N required for different dairy pastures, strategies to quickly measure dry matter (DM) yields and pasture N-uptake are needed. One way to do this is by using optical sensors to infer vegetation indices such as NDVI, SR, and WI, which are calculated from reflectance values, and have been successfully related to plant yields and foliar N (Pullanagari *et al.* 2011; Roberts *et al.* 2015). By using optical sensors to detect areas of high N in pastures, such as areas with a large number of urine patches (Haynes & Williams 1993; Jarvis *et al.* 1995), a variable rate system could avoid further fertiliser application to those areas, thereby improving NUE. Commercial optical sensors

for efficient application of N-fertiliser have been developed for intensive arable farming (Bragagnolo *et al.* 2013; Portz *et al.* 2012), but no such sensors have been developed for dairy pastures. The objective of this study was to test the performance of various vegetation indices (NDVI, WI, SR) measured from optical reflectance sensors to estimate biomass yield and N-uptake in an irrigated dairy pasture.

## Methods

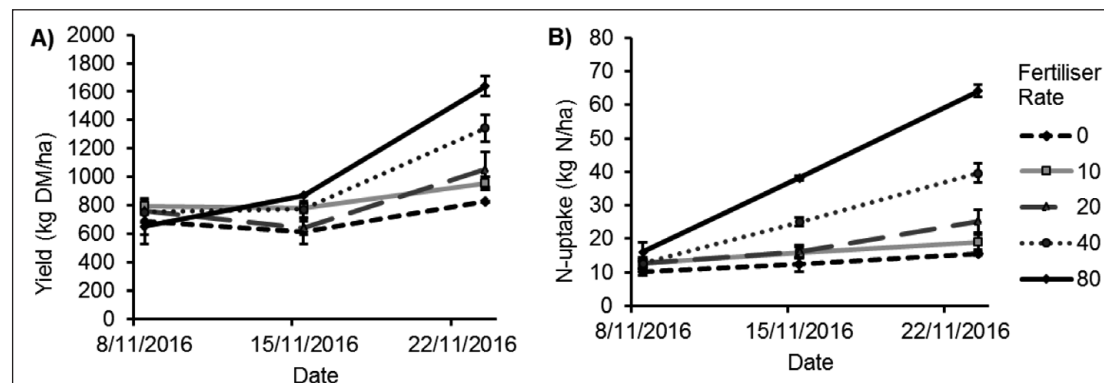
The experiment took place at Lincoln University's Ashley Dene Research and Development Station (43°38'42.0" S, 172°20'33.0" E) in Canterbury, New Zealand. The experiment was established on a stony, well-drained silty loam Balmoral Acidic Orthic Brown Soil (Hewitt 2010), with increasing stony sandy gravels beyond 15 cm depth. The newly established year-old pasture was predominantly perennial ryegrass (*Lolium perenne*), mixed with Italian ryegrass (*Lolium multiflorum*), plantain (*Plantago lanceolata*) and white clover (*Trifolium repens*). Before establishment of this pasture, the site was unirrigated and sheep-grazed.

The experimental area was subdivided into sixteen 12 x 35 m plots. On the 11 October 2016, before the experiment started, the pasture was grazed by dairy cows. Following grazing, on 13 October 2016, urea fertiliser was applied at five rates (0, 10, 20, 40 and 80 kg N/ha) by hand. Each fertiliser treatment was replicated three times in a randomised block design. During the experiment, the area was irrigated using a centre-pivot irrigator, as required. The plots were grazed again by dairy cows on the 31 October 2016, before the first data collection.

Sward reflection measurements using the sensors and calculating the vegetation indices were completed three times: 1, 2 and 3 weeks post-grazing on 7 November, 15 November, and 22 November 2016, respectively. Manual biomass collection was completed within 2 days of the sensor measurements.

## Biomass harvesting

Biomass was harvested from within each plot from five 0.5 x 0.5 m quadrats located along the middle axis of each plot. At each harvest, plants from each quadrat were cut using hand-shears to a height of ~5 cm (~1500



**Figure 1** A) mean DM yields ( $\pm$  SEM; n=9), and B) mean N-uptake ( $\pm$  SEM; n=9) of plots receiving five different fertiliser treatments (0, 10, 20, 40 and 80 kg N/ha) over one grazing cycle for the plots that were harvested 8, 15 and 22 November 2016.

kg DM/ha, Haultain *et al.* 2014). Fresh biomass was weighed and then oven-dried for up to 48 hours at 68 °C before dry weights were recorded. Dry biomass was ground and used to determine Total Nitrogen (TN, %) using the Dumas combustion method on a Vario Max CN Element Analyser (Elementar Analysensysteme GmbH, Germany).

**Optical sensing of vegetation indices**

Two active optical reflectance sensors were used to measure vegetation indices. The first was a tec-5 ALS (Active Light Source) sensor, a research version of the commercially available Yara N-Sensor (Yara Deutschland GmbH & Co. KG, Dülmen, Germany). This sensor was equipped with a xenon flash light that emits light in a range between 650 to 1100 nm onto the canopy, and offers reflectance data from four optically filtered wavelength channels (730, 760, 900, 970 nm) (Erdle *et al.* 2011). It provides values for SR ( $R_{780}/R_{670}$ ) and water index (WI) ( $R_{900}/R_{970}$ ) (Erdle *et al.* 2011). The sensor was tractor mounted and connected at a 45° angle at a height of 203 cm above the ground, and was equipped with a real-time kinetic global positioning system (Model R10, Trimble Navigation Limited, Sunnyvale, California, USA) and a laptop. The tractor speed was 0.5 m/s during measurements. On each of the 3 days that measurements were taken, the tractor-mounted sensor measured each of the 16 plots three times (longitudinally at 3, 6 and 9 m along the 12 m wide axis of the 12 x 35 m plots), to obtain spatially representative samples.

The second sensor was a hand-held Greenseeker (Trimble, Sunnyvale, California, USA) that returns values for NDVI ( $(R_{780}-R_{670})/(R_{780}+R_{670})$ ) (Erdle *et al.* 2011). This sensor works by emitting light in the range of ~ 660-770 nm, and uses the pseudo reflectance to calculate the NDVI (Erdle *et al.* 2011). The average reading per plot was taken by passing the sensor over the middle of the longitudinal axis of each of the 16

individual plots at a height of 1 m (Field of view: ~ 61 cm).

**Data analysis**

Data analysis was completed using Microsoft Excel™. The average SR and WI per plot was calculated. Nitrogen-uptake was determined by dividing the dry biomass weight (g) by %N as a fraction of one, and converting to a mass per area (kg N/ha). Using the data collected from all fertilisation treatments, linear regression models were computed between DM yield (kg/ha) and each of the vegetation indices (NDVI, WI, and SR). The same analysis was completed using the N-uptake (kg/ha) and the vegetation indices.

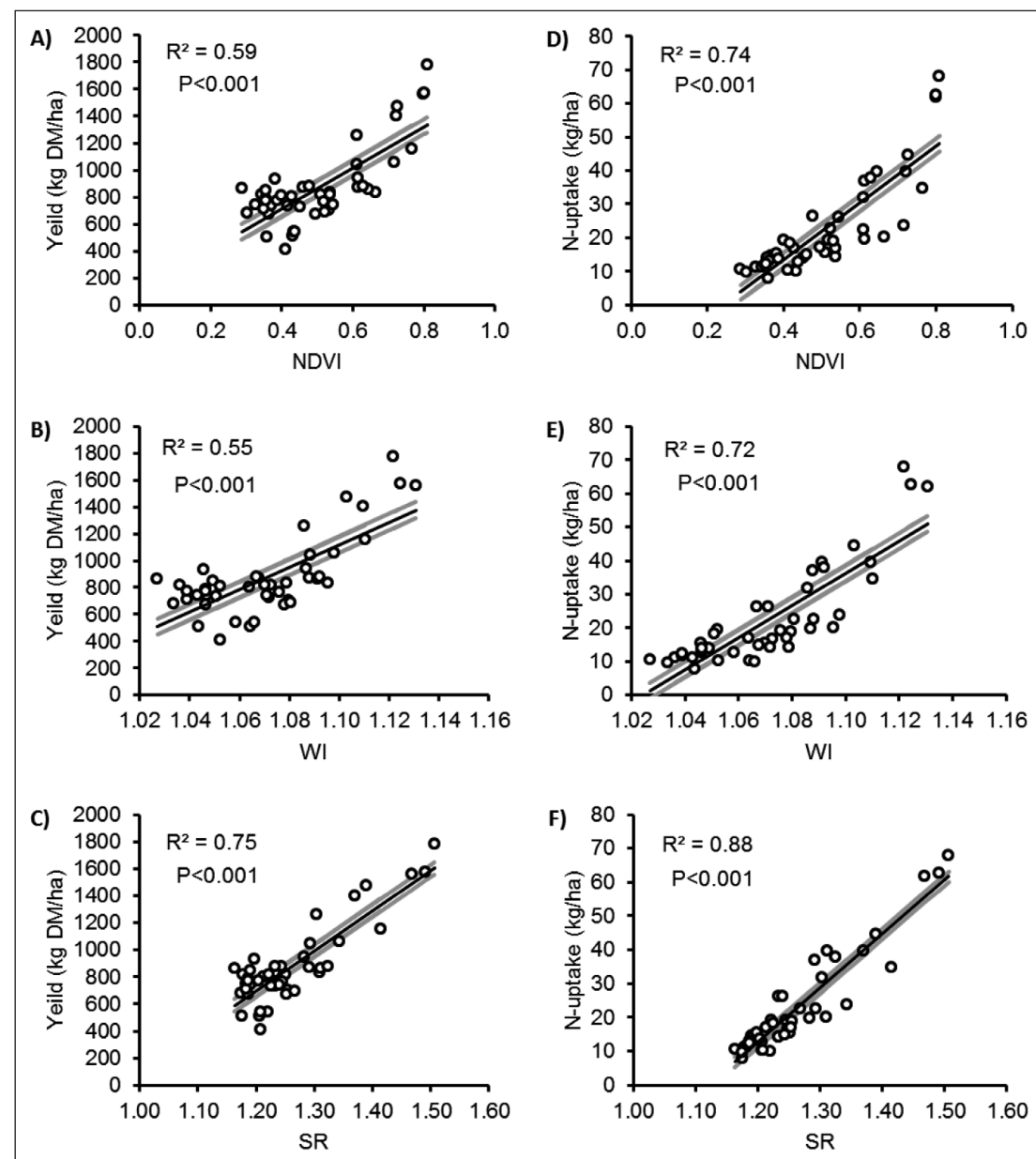
**Results**

**The influence of nitrogen application on yield and foliar-N**

Immediately following defoliation, no increase in biomass was observed up to 40 kg N/ha. The early increase in foliar-N and subsequent increase in dry matter yield resulted in a linear increase in N-uptake (kg N/ha) in all treatments from 8 to 23 November 2016 (Figure 1B). Increases in dry matter yield in all treatments ranged from 21% in the control to 155% in the 80 kg N/ha treatment (Figure 1A). Over the same time, N% in the foliage increased from 1.5-2.4% to 2-4.4%, followed by a decrease to 1.9-3.9%, as dry matter yield increased for all fertiliser treatments.

**Optical sensors detect differences in dry matter yield and N-uptake**

The optical sensor measurements were related to the dry matter yield (Figure 2 A-C). While the R<sup>2</sup> value suggests a linear relationship between dry matter yield and NDVI (Figure 2 A), and WI (Figure 2B), both relationships showed some non-linear characteristics, with points above the line at the high and low end of the indices, and below the line in the mid-range of



**Figure 2** Relationships between dry matter yield (kg DM/ha) and: A) the normalised difference vegetation index, B) the water index, and C) the simple ratio. Relationships between nitrogen-uptake and: D) the normalised difference vegetation index, E) the water index, and F) the simple ratio. Each graph shows the coefficient of determination (R<sup>2</sup>), and level of significance (P-value) for the linear relationships, and the upper and lower 95% confidence intervals (in grey) around the linear regression line (black) between each pair of variables.

the indices. Similar trends were observed between N-uptake and NDVI (Figure 2 D), and WI (Figure 2 E), where data showed a similar curvature about the linear trend line. The relationships between SR and dry matter yield (Figure 2 C), and N-uptake (Figure 2 F), showed strong and distinctive linear relationships between the variables with little scatter.

**Discussion**

**Vegetation indices to detect changes in N-uptake and plant biomass**

As expected, higher rates of N-accumulation in plant foliage and greater dry matter yields were associated with higher N-fertilisation rates, which are consistent with previous findings (Monaghan *et al.* 2005). All

tested vegetation indices measured by the optical sensors were able to detect differences in dry matter yield and N-uptake in the pasture plants.

Strong relationships between WI and dry matter yields in grass-only pastures, and weaker relationships for pastures mixtures of ryegrass and white clover, have been reported from measurements made using a Yara active optical reflectance spectrometer (Roberts *et al.* 2015), similar to the one used in the current study. The current study demonstrates the suitability of the SR index for inferring biomass and N-uptake in mixed-pastures (ryegrass-clover) that are typical of irrigated cattle-grazed pasture. The strong relationship between SR and N-uptake is especially promising because N-uptake is considered to be a robust agronomic parameter for determining site specific N-fertilisation (Portz *et al.* 2012). However, other studies have noted the influence of season on the ability of active optical sensor output to relate to biomass due the effects of senescence (Trotter *et al.* 2012). Future work is required to verify the suitability of the use of the SR index for variable rate fertilisation in grazed and irrigated pastures by repeating the experiment with variations of the pasture plant species used in this study, at different plant ages and times of the year, and at different pasture densities.

The visible deviations from linearity observed with the use of NDVI and WI are an important finding given the wide range of N conditions induced by the different rates of fertilisation. Others have similarly reported non-linear behaviour between NDVI and dry matter yield (Trotter *et al.* 2012) and N-uptake (Bragagnolo *et al.* 2013). This work provides a reference for interpretation of results in future studies that have not implemented, or do not have available, such a wide range of N. Over a smaller N range, the curvature in the data may not be apparent. Pastures grazed by cattle are likely to have sporadic areas of high N and biomass due to urine patches, which can cover ~20% of a pasture, annually (Moir *et al.* 2011). Without a comprehensive understanding of what causes of the curvatures in the data (lack of instrument sensitivity, the need for calibration, or plant factors such as age, density of the pasture, etc.) and a suitable compensation method, there is a risk that using NDVI or WI to make decisions related to variable rate fertilisation may lead to under or over application of fertiliser.

#### Feasibility of sensors use on-farm

The optical sensors tested in this study have the benefit of providing simple outputs, as well as flexible mounting options so the sensors can be deployed on available farm infrastructure (i.e. tractor, irrigator). The accuracy and precision of the data obtained from these devices is dependent on the angle of view and

height at which they are mounted (Kipp *et al.* 2014). These factors along with further investigation into what influences the relationship between these indexes and dry matter and N-uptake are needed. For example, what factors cause the curvature in the data, need to be identified before a variable rate fertiliser application system could be used by farmers.

#### Conclusions

Active optical sensors offer the potential to develop real time variable rate N-fertilisation systems. Of the measured indices, SR showed the most linear and consistent relationships to N-uptake and dry matter yields over a range of foliar-N conditions. The ability to apply N-fertiliser in the right place, at the right time, and in the right amount, will increase NUE and reduce environmental impacts of N-loss in grazed pasture systems.

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