



# Phenotyping agriculture management effects on remote sensing assessments of maize hybrids performance



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2<sup>nd</sup> International Electronic  
Conference on Remote Sensing

22 March–5 April 2018





## Introduction

- Context
- Conservation Agriculture
- Remote Sensing and Phenotyping

## Materials and Methods

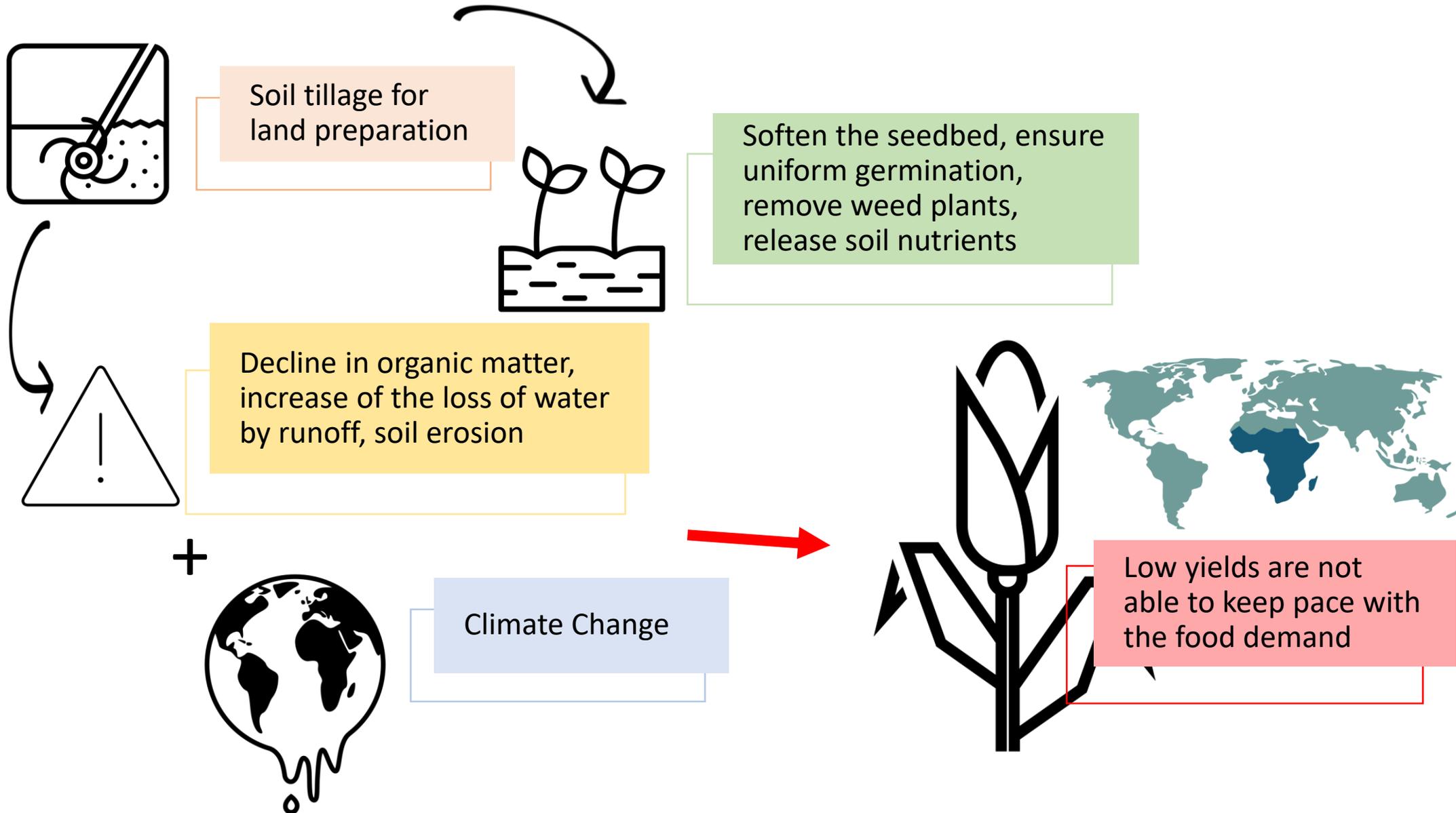
- Proximal (ground) data collection
- Aerial data collection

## Results and Discussion

- Implications of growing conditions on yield
- Comparative performance of the vegetation indexes at determining differences in grain yield

## Conclusions

# Introduction - Context



# Introduction – Conservation Agriculture



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alternative solution...

Minimum soil  
disturbance



Permanent  
soil cover



Crop rotation



Conservation Agriculture  
(CA)



Increase of yields while reducing  
negative effects of conventional  
farming practices

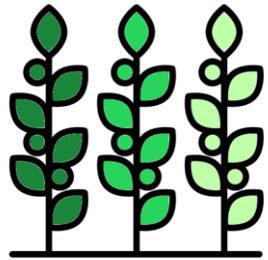
# Introduction – Phenotyping and Remote Sensing



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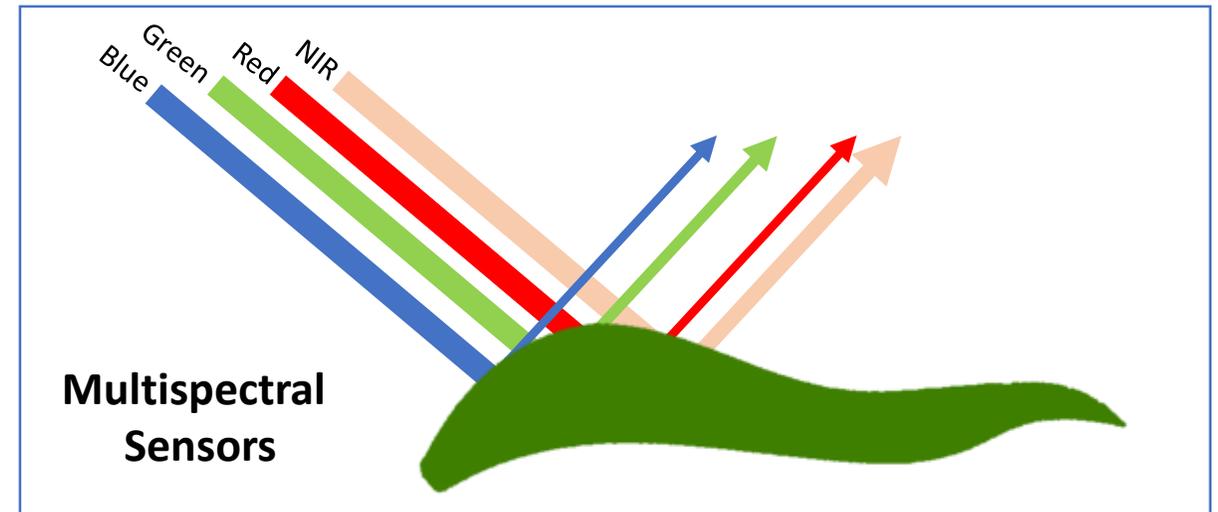
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Most new cultivars have been developed under full tillage conditions



Field Phenotyping

Genotype selection for a better performance under CA



Conventional  
Digital Cameras





The aim of the present study was to:

- Evaluate the efficiency of a set of remote sensing indexes in assessing the yield differences of different maize hybrids at early growth stages under conventionally ploughed (CP) and zero-tillage (CA) conditions.

# Materials and Methods



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**Domboshawa Training Centre**  
(17°37'S, 31°10'E and 1560 m.a.s.l.),  
situated at the north-east of Harare  
(Zimbabwe)  
2015/2016 crop season

Seven maize drought tolerant commercial hybrids (**SC621**, **Pan53**, **30G19**, **Zap55**, **Pristine601**, **PGS61** and **Zap61**) and one drought-sensitive commercial control variety (**SC513**)

Conventionally Ploughed (**CP**)

Conservation Agriculture (**CA**): No-tillage and the application of 2.5-3.0 Mg ha<sup>-1</sup> of maize stover to all the plots



CP

CA

# Materials and Methods – Data collection



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## Proximal (ground)



## Aerial



**Mikrokopter OktoXL 6S12**

Altitude: 30 m



# Materials and Methods – Data collection



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Proximal (ground)

Aerial

RGB images



Olympus OM-D



Lumix GX7



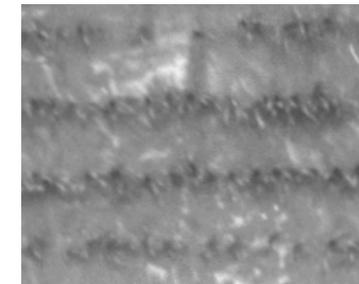
Multispectral



GreenSeeker

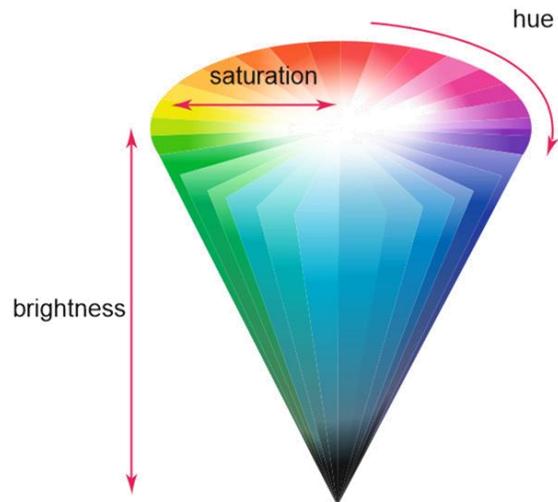


micro-MCA12  
Tetracam



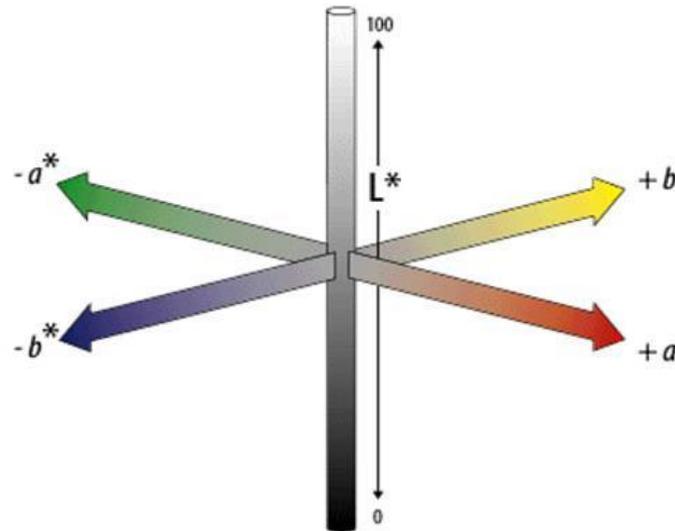


## HIS color model



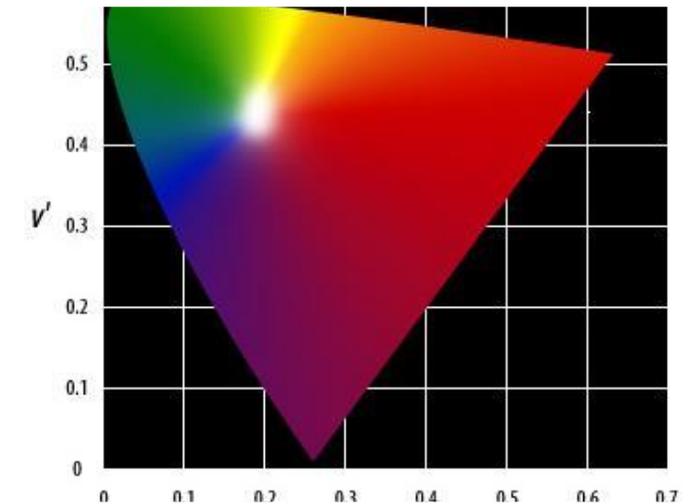
Green Area (**GA**)  
(% pixels con  $60^\circ < \text{Hue} < 120^\circ$ )  
Greener Area (**GGA**)  
(% pixels con  $80^\circ < \text{Hue} < 120^\circ$ )

## CIElab color model



**a\*** and **u\***  
The more negative,  
the more greenness.

## CIEluv color model



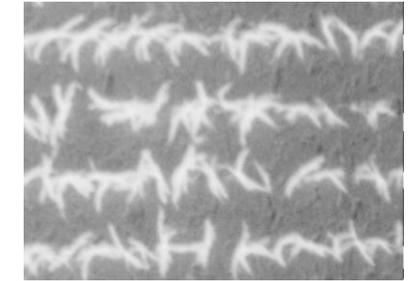
CIMMYT Maize Scanner  
(FIJI Research Plugin)

# Materials and Methods – Multispectral indexes



**Table 1.** Indexes derived from the multispectral visible and near infrared bands.

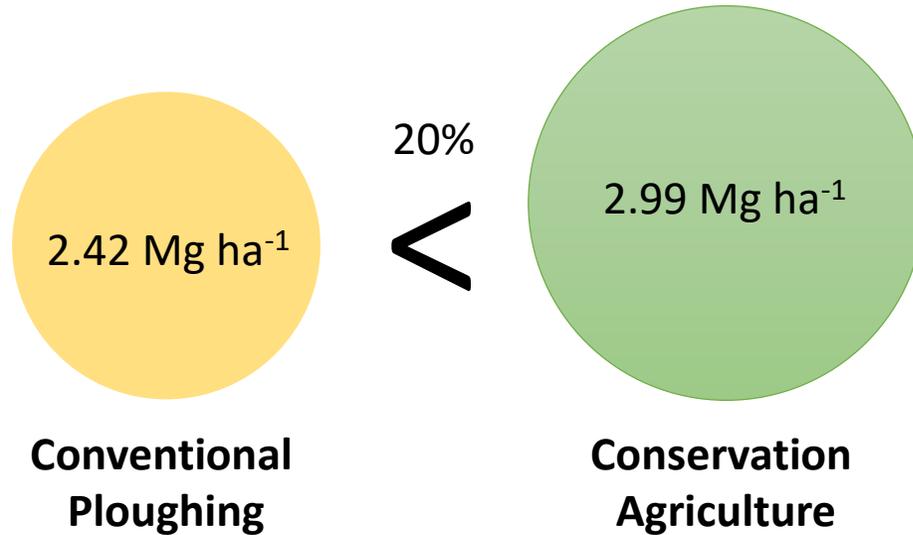
Group	Index	Equation	Wavelengths	References
	Normalized Difference Vegetation Index (NDVI)	$\frac{(B840 - B670)}{(B840 + B670)}$	Red, NIR	(Rouse et al., 1973)
	Soil Adjusted Vegetation Index (SAVI)	$\frac{(B840 - B670)}{(B840 + B670 + L)}$	Red, NIR	(Huete, 1988)
Broadband Greenness	Optimized soil-adjusted vegetation index (OSAVI)	$\frac{(1 + 0.16) \cdot (B780 - B670)}{(B780 + B670 + 0.16)}$	Red, NIR	(Rondeaux et al., 1996)
	Renormalized Difference Vegetation Index (RDVI)	$\frac{(B840 - B670)}{\sqrt{(B840 + B670)}}$	Red, NIR	(Roujean and Breon, 1995)
	Enhanced Vegetation Index (EVI)	$\frac{2.5 \cdot (B840 - B670)}{(B840 + (6 \cdot B670) - (7.5 \cdot R450) + 1)}$	Blue, Red, NIR	(Huete et al., 2002)
Light Use Efficiency	Photochemical Reflectance Index (PRI)	$\frac{(B550 - B570)}{(B550 + B570)}$	Green	(Gamon et al., 1997)
Leaf Pigments	Modified Chlorophyll Absorption Ratio Index (MCARI)	$(R700 - R670) - 0.2 \cdot (R700 - R550) \cdot \left(\frac{R700}{R670}\right)$	Green, Red, NIR	(Daughtry, 2000)
	Chlorophyll Content Index (CCI)	$\frac{(B550 - B670)}{(550 + B670)}$	Green, NIR	(Gamon et al., 2016)



Soil mask

Pixels NDVI <0.4-1

# Results and Discussion: Grain Yield



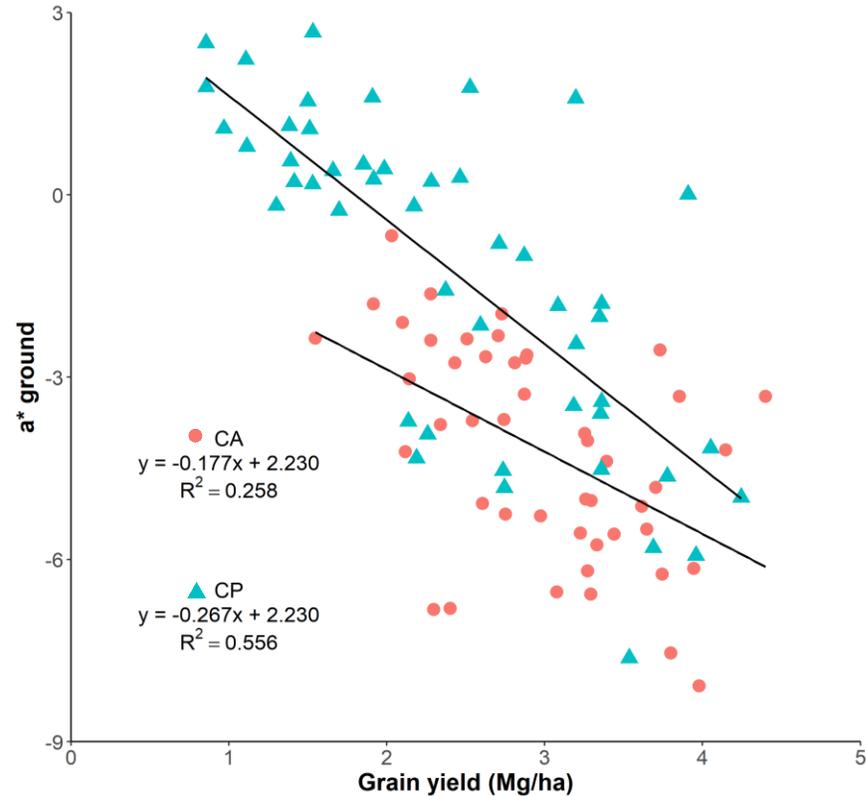
Since crop management has led to a considerable increase in yield, **changes in genotype** may be an option **to make use of the enhanced yield potential** provided by this environmental factor.



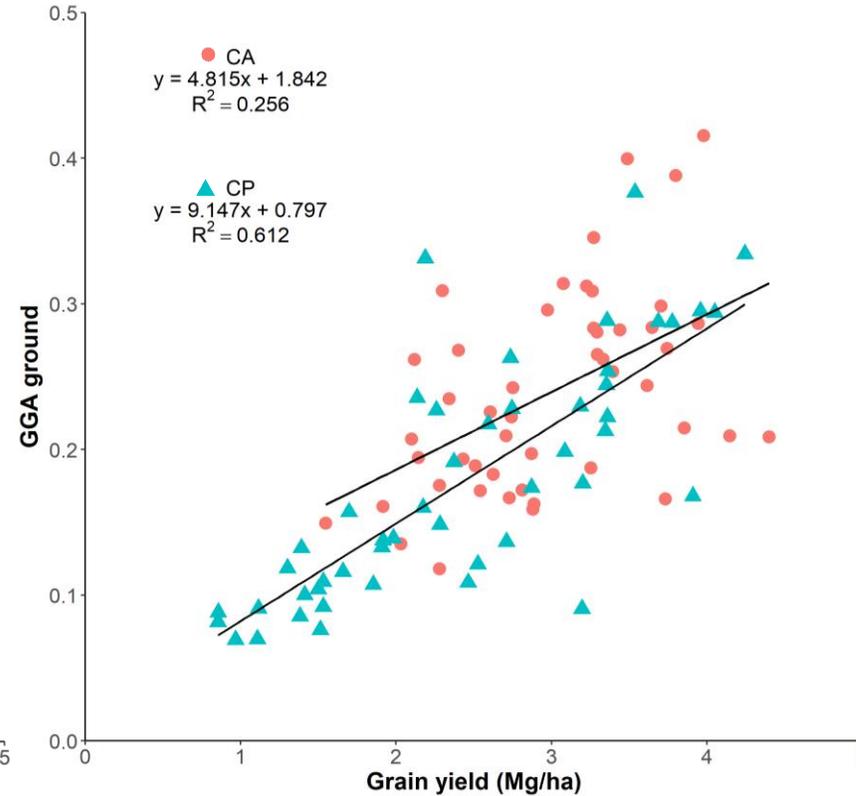
# Results and Discussion – RGB indexes performance



$a^*$



GGA



Indexes related to  
canopy greenness

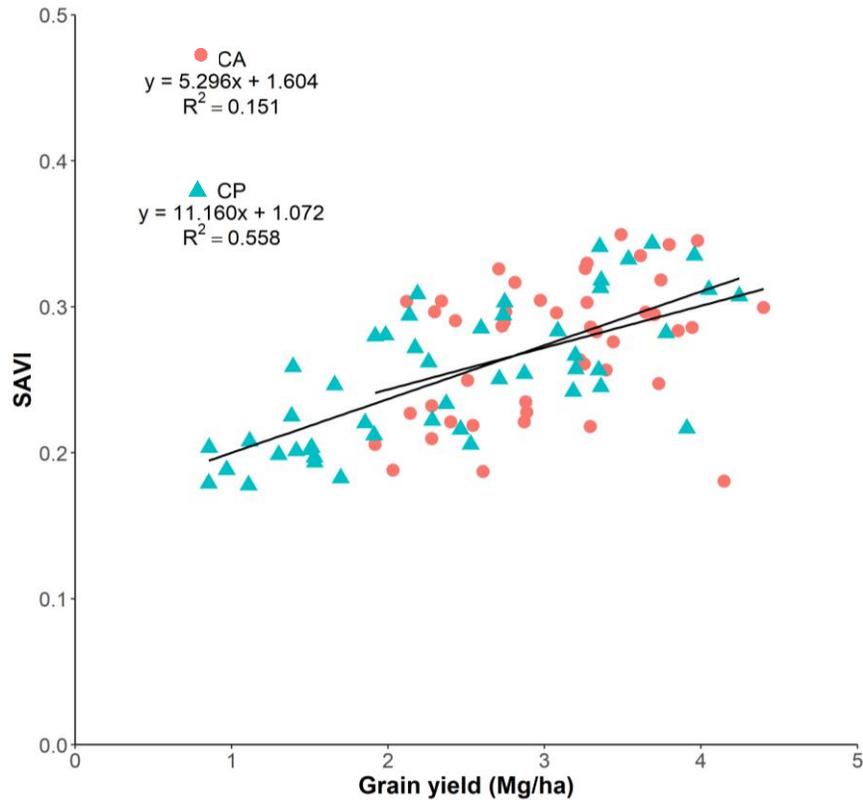


Elevated values of these indexes, driven by higher biomass levels, **help to anticipate higher yields** even at early growing stages.

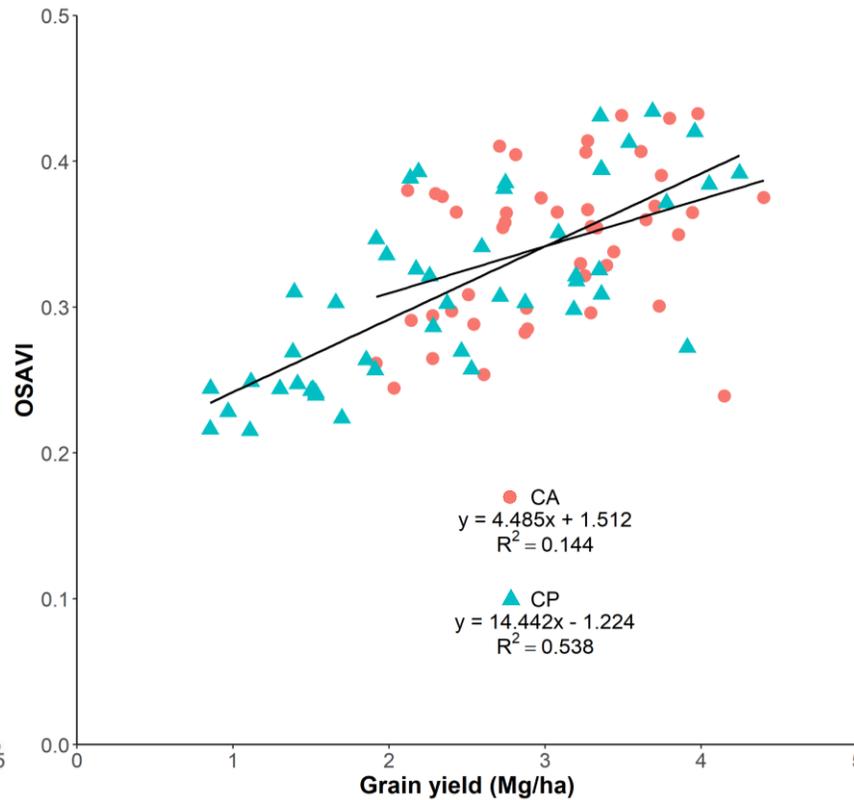
# Results and Discussion – Multispectral indexes perf.



## SAVI



## OSAVI



Indexes related to canopy greenness



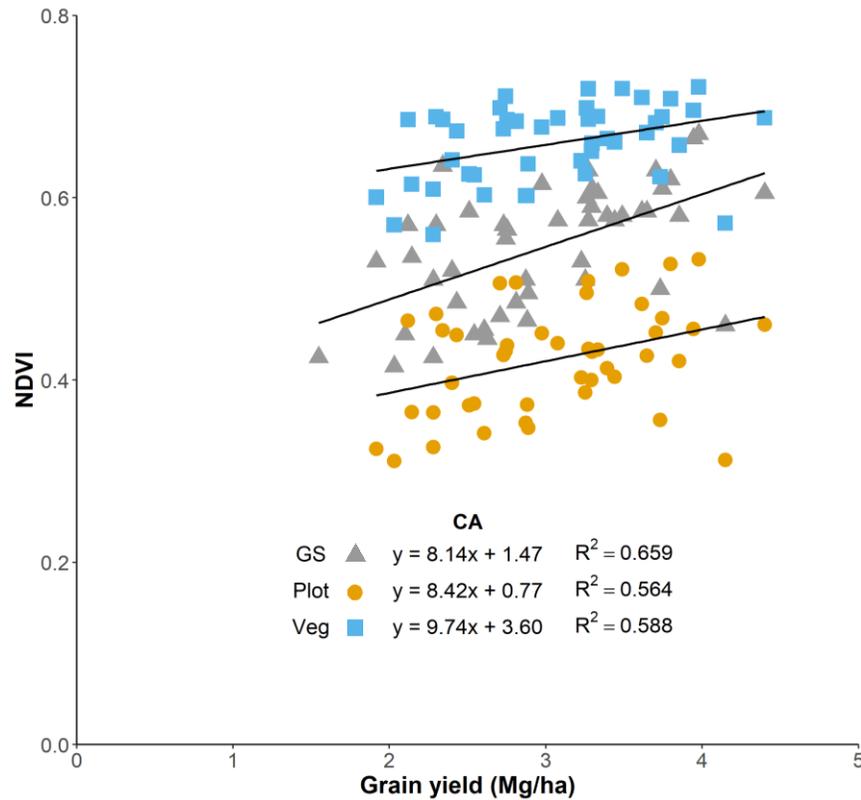
Those indexes contain information from the red reflectance region, which increases with a reduction of the biomass density.

↑ SAVI =  $\frac{(B_{840} - B_{670})}{(B_{840} + B_{670} + L)}$  ↓ NIR

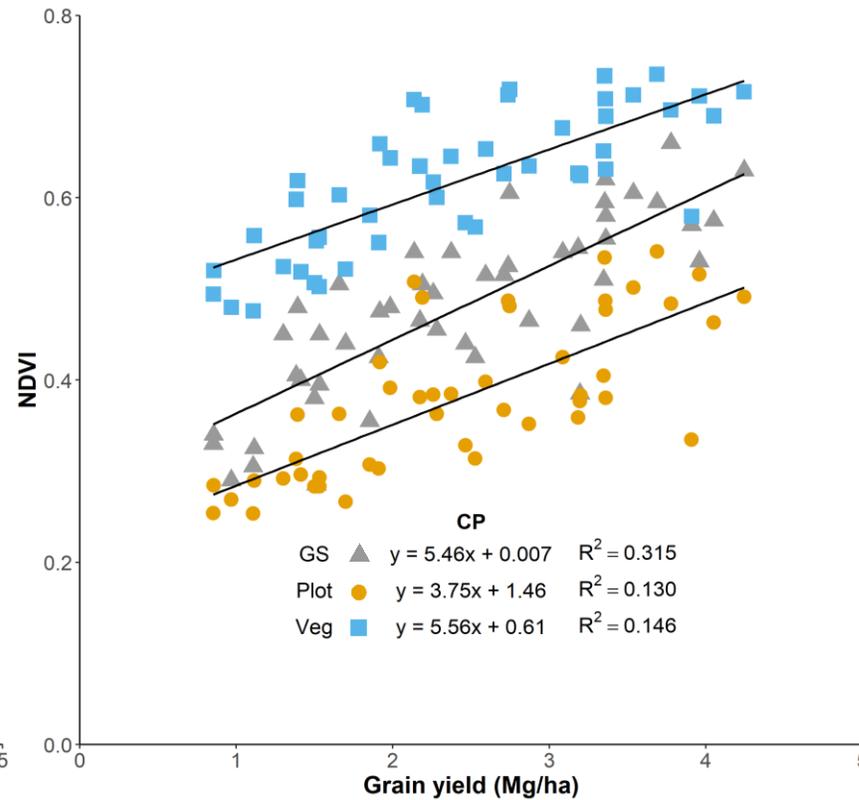
# Results and Discussion – Multispectral indexes perf.



CA



CP



According to the FAO definition, the soil surface has to be covered at least by 30% to qualify as CA.



Influence on remote sensing measurements.

# Conclusions



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CA management practices had a positive effect on increasing yields as compared to CP system. These results may help support the adoption of CA to combat declining yields that affect SSA agriculture.

Future efforts should be focus on the study of the impact of the genotype selection for a particular management system and dissect that traits associated with a better performance under CA

Even at early crop growth stages, the different RGB and multispectral indexes effectively assess yield differences under CA conditions, even if their performance is lower than under CP conditions.

The platform proximity effect on the image resolution did not have a negative impact on the performance of the indexes, reinforcing the usefulness of UAV and its associated image processing for high throughput plant phenotyping studies under field conditions.



**Many thanks for your attention!**  
**Muchas gracias por vuestra atención!**  
**Moltes gràcies per la vostra atenció!**



# Phenotyping agriculture management effects on remote sensing assessments of maize hybrids performance

## Contact information

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