

Hyperspectral derived nitrogen indicators for maize crop

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Objectives

Evaluate the potential of airborne hyperspectral to detect maize parcels with inappropriate nitrogen fertilization

- **Analysing experimental plots (two varieties and four N fertilization levels)**
- **Proposition of indicators related to nitrogen supply in order to detect over- and under-fertilization.**
- **Validation of the indicator based on farmer parcels**
- **Extension to the whole maize parcels covered by the image**



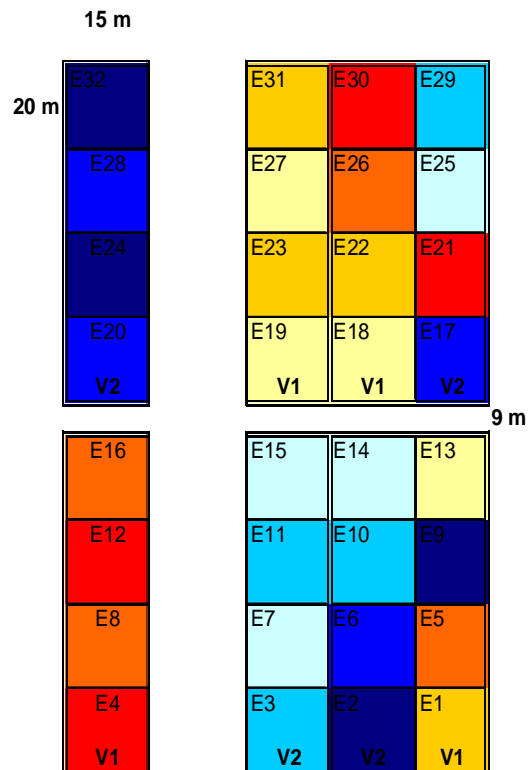
Study Area

Experimental parcel

1 parcel located in Attert (South of Belgium)

32 experimental plots

- 2 varieties (Orange / Blue)
- 4 nitrogen levels (Light → Dark)





Study Area

Farmers parcels

20 farmer parcels

- 10 in Belgium
- 10 in Luxembourg

2 samples in each parcel





Ground Measurements

Field campaign date : 30/07/2004

<p>Plants</p>	<ul style="list-style-type: none"> • Fresh / Dry biomass • Phenology • Chlorophyll content • Leaf Area Index • Plant height • Fluorescence • Nitrogen content 	<p><i>July 2004</i> <i>October 2004</i></p>
<p>Soil</p>	<ul style="list-style-type: none"> • N min 	<p><i>April / May 2004</i> <i>Octobre 2004</i></p>
<p>Agricultural practices</p>	<ul style="list-style-type: none"> • Previous crops • Sowing date • Nitrogen fertilization • Harvest date • Winter cover 	

Spectral measurements



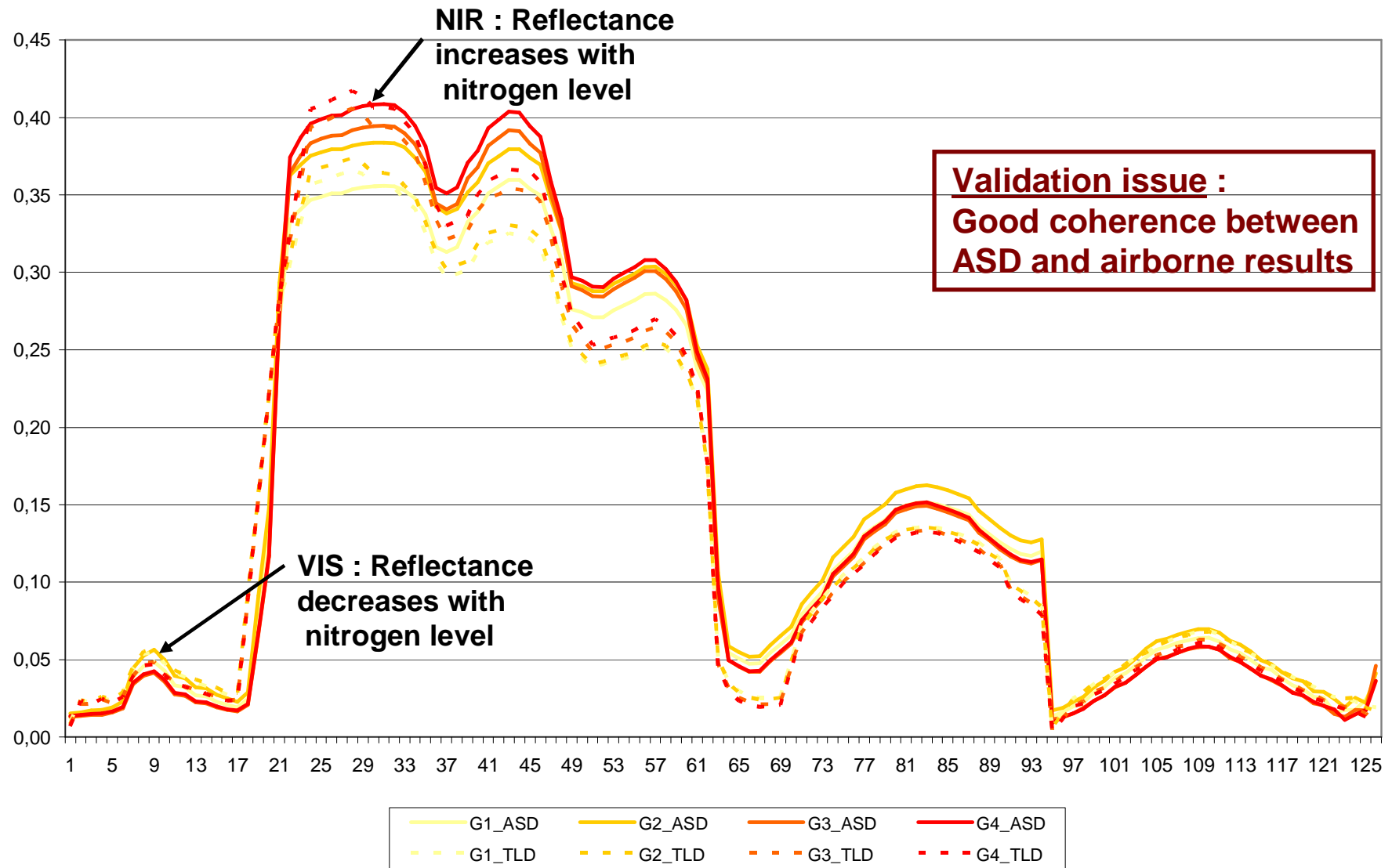
- Between 440 et 2482 nm
- Chanel : 15 to 16 nm

- Between 350 et 2500 nm
- Chanel : 1 nm





Preliminary discrimination

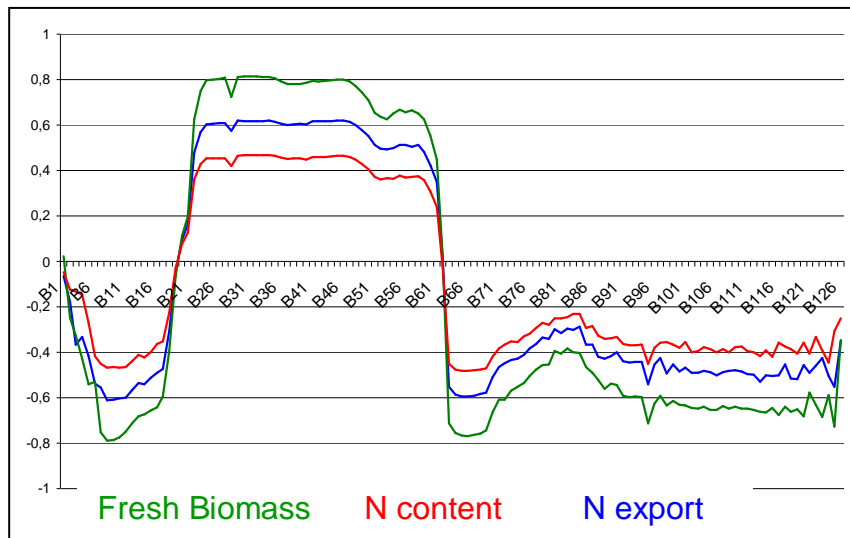




Statistical analysis

To select relevant bands

Correlation with biophysical parameters



+

Multiple regression (Stepwise, Principal Components, Partial Least Square)

Selected bands

B9	558
B32	896
B66	1448
B45	1099
B21	740
B126	2482
B6	512
B5	498
B10	573
B16	667
B17	680
B19	717
B22	750
B28	846



Variance analysis

N level	Variety	Interaction
S	NS	NS
S	NS	NS
S	NS	NS
S	NS	NS
NS	NS	NS
NS	NS	NS
NS	NS	NS
NS	NS	NS
NS	NS	NS
S	NS	NS
S	NS	NS
NS	NS	NS
NS	NS	NS
S	NS	NS
S	NS	NS

S = Significant (5%)

NS = Non Significant (5%)

Interesting bands in Visible and Near Infrared



First conclusions

And indicators proposal

- I. Good coherence between ASD and airborne results → We will work only with Airborne hyperspectral data (spatialisation objective)
- II. Good discrimination of nitrogen levels in spectrum → Combination of different bands from different spectral regions should improve the spectral signature recognition (vegetation indices)
- III. 8 bands in visible and near infrared → Focus on these spectral bands

+ Literature



I1 : Reflectance B9 (558 nm)

I2 : TCARI (Transformed Chlorophyll Absorption in Reflectance)

I3 : NDVI B32 (896 nm) and B22 (750 nm)

I4 : NDVI B45 (1099 nm) and B22 (750 nm)

I5 : GNDVI B27 (831 nm) and B9 (558 nm)

I6 : Red-edge

I7 : Reflectance B32 (896 nm)

I8 : NDVI B22 (750 nm) and B9 (558 nm)

I9 : Simple Ratio (B18/B22)



Indicator selection

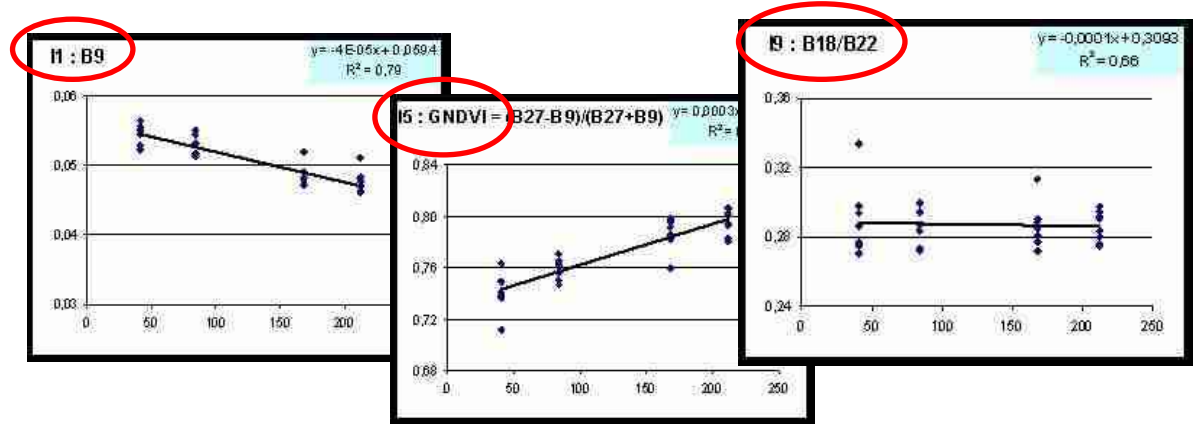
Indicators

Criteria

Illustration

I1, I2, I3,
I4, I5, I6,
I7, I8, I9

High variability inter
N level
Low variability intra
N level



I3, I4, I5, I8

Significative effect
of N level
No significative
effect of variety
Best determination
coefficient value

Indicator	N level	Variety	R ²	Adjusted R ²
I3	S**	S*	0.864	0.823
I4	S**	NS**	0.791	0.727
I5	S**	NS**	0.818	0.763
I8	S**	NS**	0.797	0.735

* Significant at 1% ** Significant at 5%

I5

$$\text{GNDVI} = (\text{NIR} - \text{G}) / (\text{NIR} + \text{G})$$

831 nm 558 nm



GNDVI thresholds

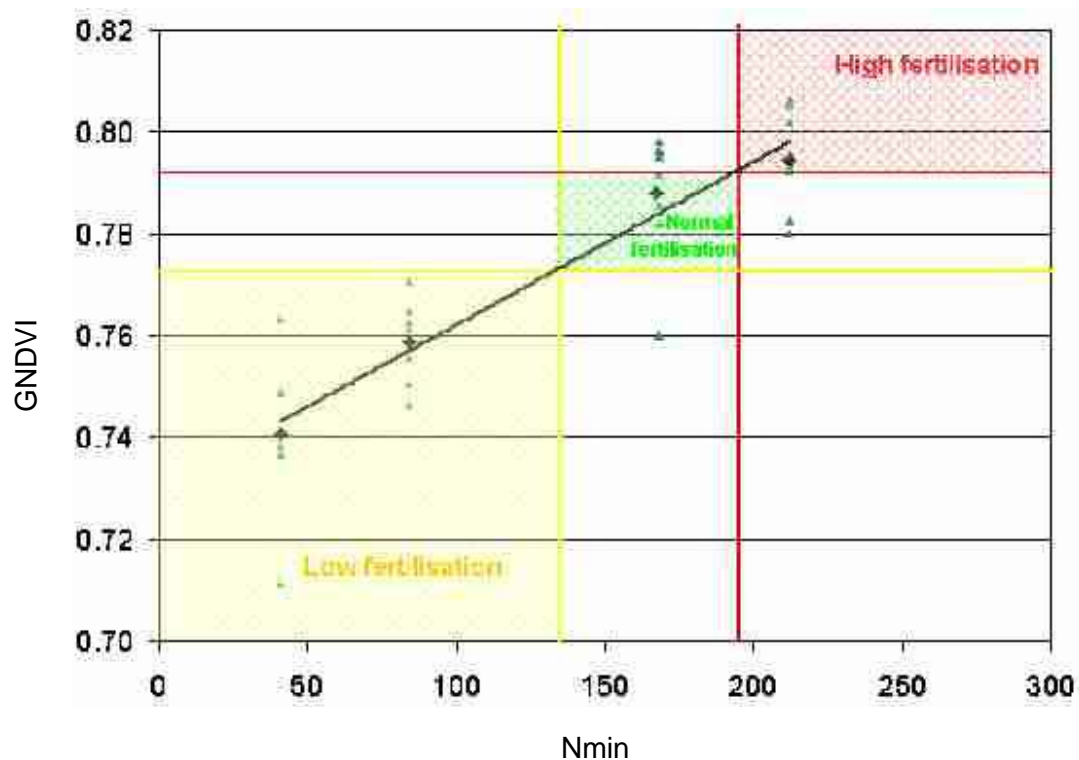
Based on experimental plots

Empirical method

Reference : Low fertilisation : $N_{min} \leq 135$ kg/ha

High fertilisation : $N_{min} \geq 195$ kg/ha

Empirical Method based on N_{min} / GNDVI relation



Fertilization classes

Low fertilization : $GNDVI \leq 0.773$

High fertilization : $GNDVI \geq 0.792$

Normal fertilization : $0.773 < GNDVI < 0.792$



GNDVI thresholds

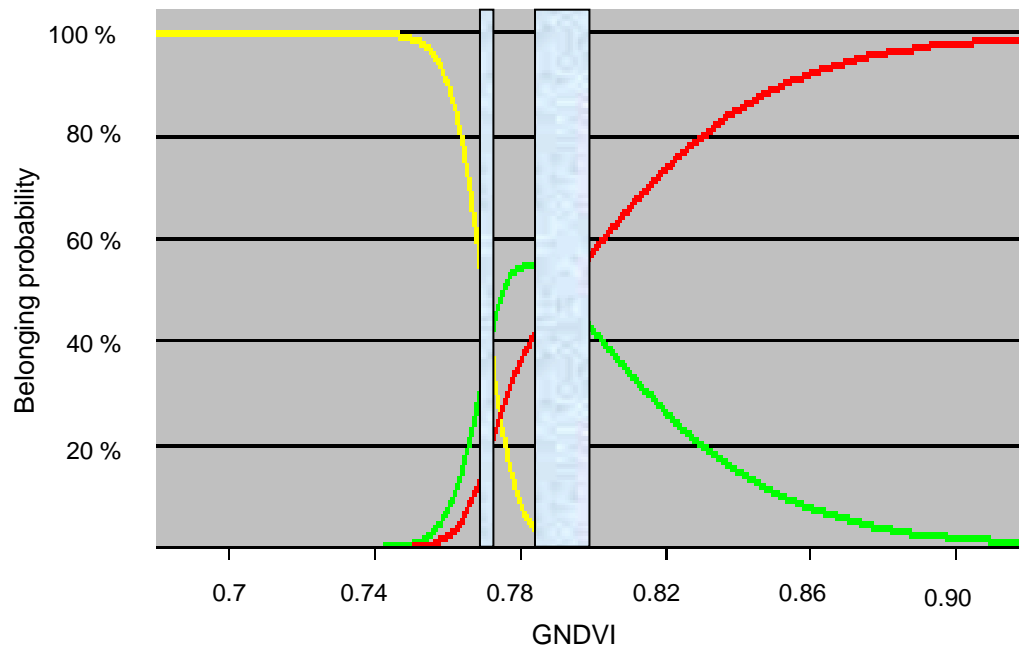
Based on experimental plots

Statistical method

Reference : Low fertilization : $N_{min} \leq 135$ kg/ha

High fertilization : $N_{min} \geq 195$ kg/ha

Linear discriminant analysis



Fertilization classes

Low fertilization : $GNDVI \leq 0.770$

High fertilization : $GNDVI \geq 0.800$

Normal fertilization : $0.773 < GNDVI < 0.783$

$0.770 - 0.773$

$0.783 - 0.800$

Undetermined



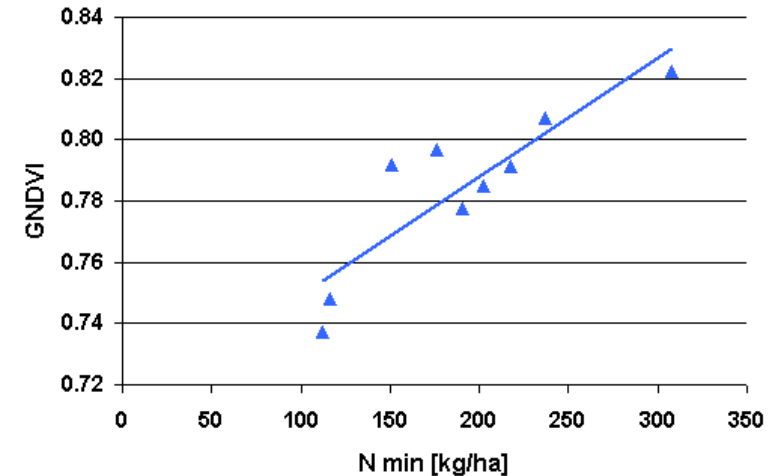
Validation

On farmer's fields

Validation on 9 farmer's parcels located in Luxemburg

	Low (%)	Normal (%)	High (%)	Calculated class	Reference class
1	1	49	50	-	3
2	0	25	75	3	3
3	0	36	64	3	3
5	3	54	43	-	3
6	0	45	55	-	2
7	14	53	33	2	2
8	0	49	50	-	2
9	100	0	0	1	1
10	99	1	0	1	1

$R^2 = 0.77$

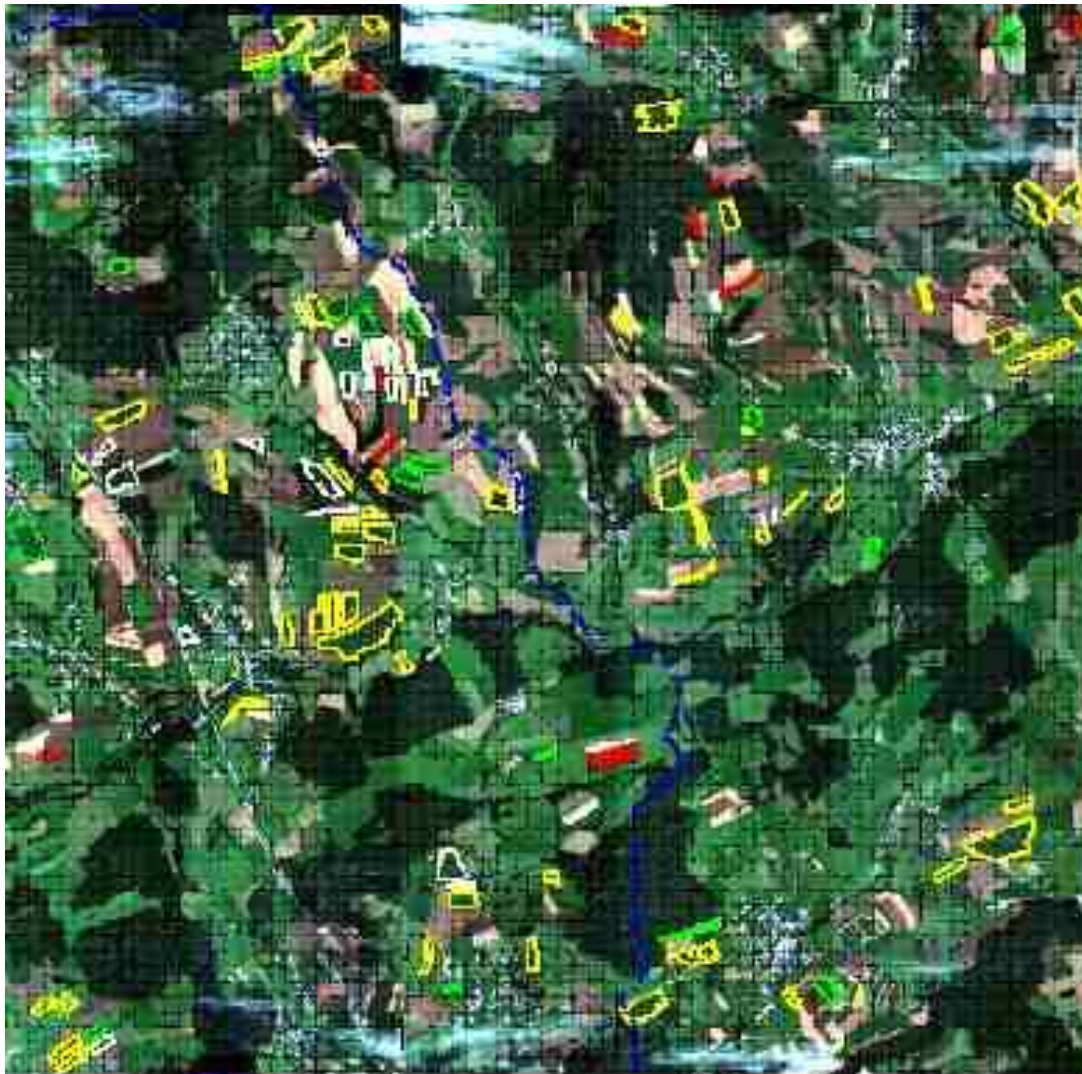






- The class is assigned according to the highest belonging probability
- If $(P_{\max} - P_{\text{med}}) < 15$, then class = undetermined
- 100% succes BUT not enough parcels
- Good correlation between Nmin and GNDVI for the validation parcels



Spatialisation

On agricultural fields



-  Low fertilisation
-  Normal fertilisation
-  High fertilisation
-  Undetermined

Belgium

Luxemburg

Conclusions

- GNDVI combining green and NIR information

$$(R_{831} - R_{558}) / (R_{831} + R_{558})$$

- Under-fertilization better discriminated than over-fertilization, normal fertilization less easily differentiated from high level fertilization
- No significant effect of the variety on the N_{\min} – GNDVI relationship
- The belonging probability allows to focus on parcels with the most extreme fertilizations (low or high)



Tool to select parcels where N-Fertilization looks abnormal.

But the validation has to be carried on a larger number of parcels in Belgium and Luxemburg.



Thank you