



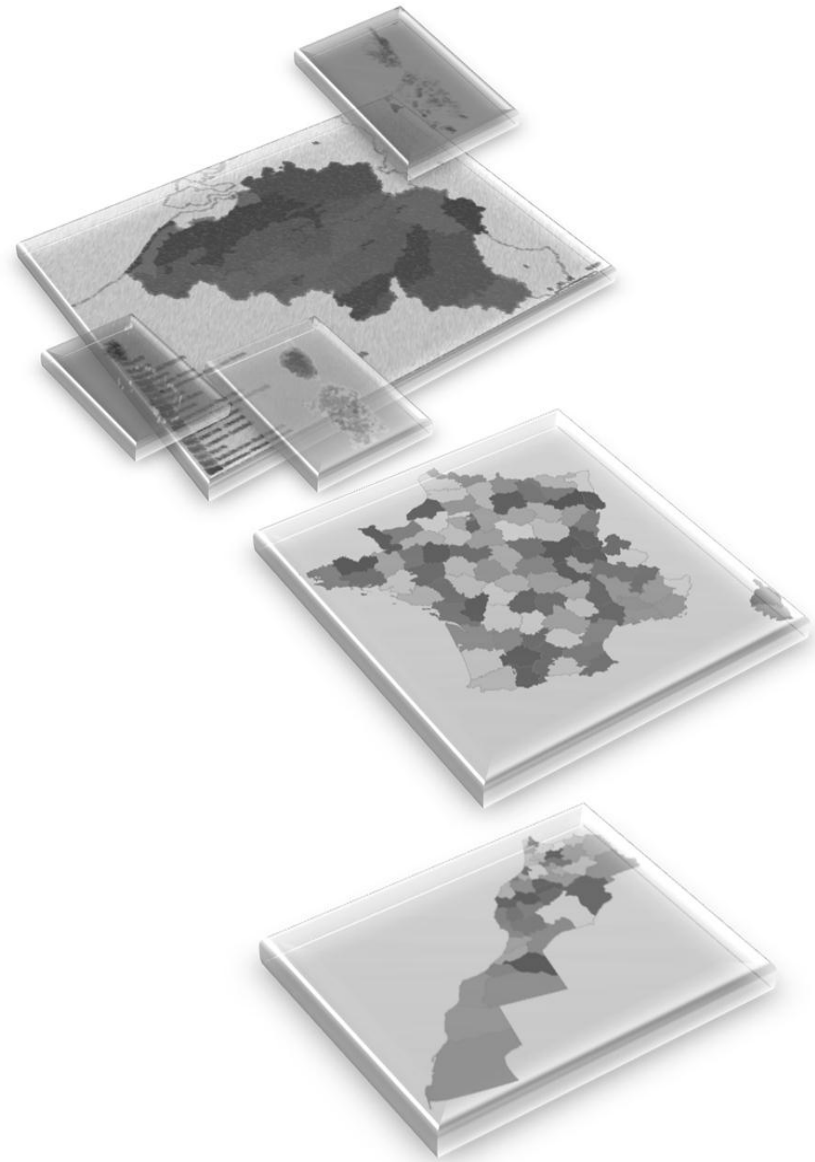
34th EARSeL Symposium, Warsaw

Improving Remote Sensing Derived Dry Matter Productivity By Reformulating The Efficiency Factors: Case Studies For Wheat And Maize

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Outline

- » Introduction
- » Research Questions
- » Methodology
- » Results
- » Conclusions, Limitations and Future Work



Introduction

- » DMP
 - » overall growth rate or dry biomass increase of the vegetation
 - » kgDM/ha/day
 - » directly related to NPP (Net Primary Productivity, in gC/m²/day)
- » DMP/NPP is a fundamental ecological variable because
 - » it measures the energy input to the biosphere and terrestrial carbon dioxide assimilation.
 - » it indicates the condition of the land surface area and status of a wide range of ecological processes.
 - » it is a unique integrator of climatic, ecological, geochemical and human influences.

Introduction

- » The Remote Sensing research unit of VITO has started to produce Dry Matter Productivity (DMP) estimate images on a regular basis since 2000.
- » The DMP¹ product of VITO is based on the Light Use Efficiency (LUE) approach first formulated by Monteith.

$$\text{DMP} = R * \epsilon_p * f\text{APAR} * \epsilon_{\text{ACT}} * \epsilon_{\text{AR}}$$

$$\epsilon_{\text{ACT}} = \epsilon_{\text{RUE}} * \epsilon_{\text{T}} * \epsilon_{\text{CO2}} * \epsilon_{\text{H2O}}$$

(¹Veroustraete, F., Sabbe, H. & Eerens, H. (2002) Estimation of carbon mass fluxes over Europe using the C-Fix model and Euroflux data. Remote Sensing of Environment, 83, 376–399.)

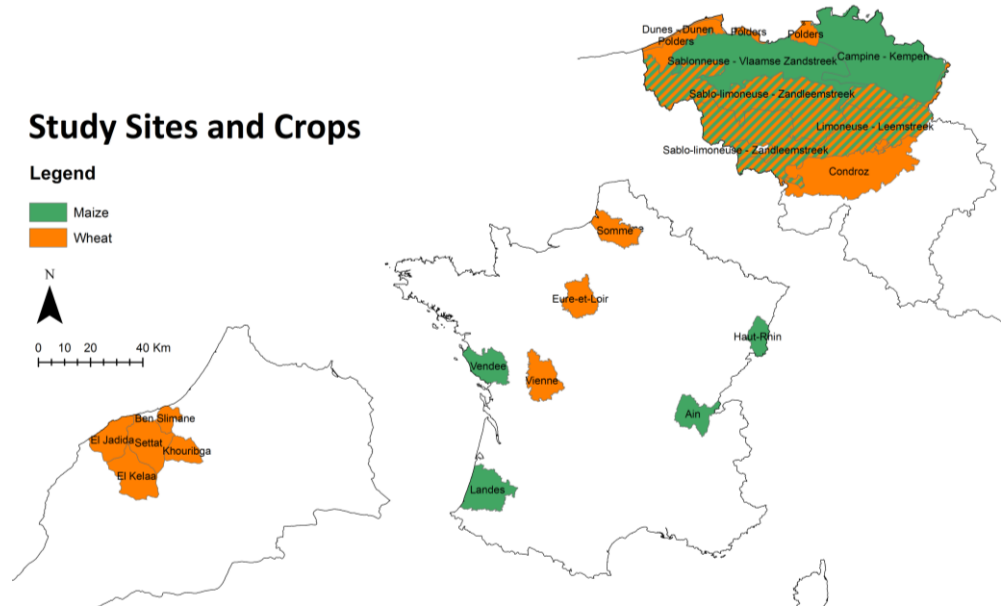
Research Questions

- » In terms of crop yield estimations,
 - » can adding water stress factor (ϵ_{H_2O})
 - » can reformulating stress factors for C_3 and C_4 plants

make any improvements?

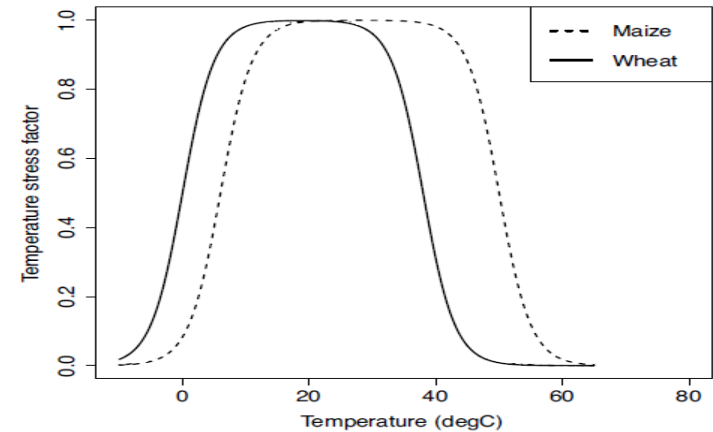
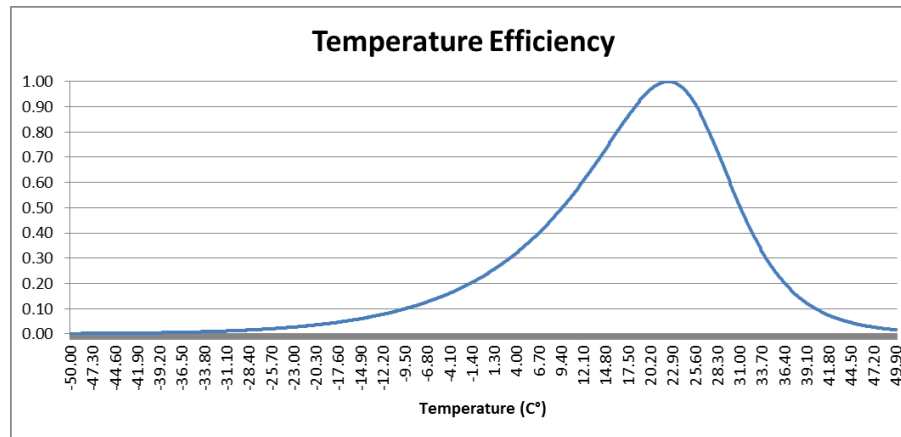
Methodology

- » Study sites and crops
 - » Belgium and France - winter wheat (C_3) and forage maize (C_4)
 - » Morocco - soft wheat (C_3)
- » Data (1999 – 2012)
 - » fAPAR – SPOT VGT
 - » Radiation, temperature – ALTERRA
 - » Precipitation and potential evapotranspiration – ECMWF



Methodology

» ϵ_T – Temperature Effect



Source: (Deryng et al. 2011)

Table 1. Response of total and plant-component dry matter of an old hybrid (Pride 5) and a new hybrid (Pioneer 3902) at the 10-leaf stage to three temperature regimes

| Temperature (°C) | Hybrid | Roots | Stems | Leaves | Total |
|------------------|--------------|----------------------|-------|--------|-------|
| | | (g m ⁻²) | | | |
| 16/7 | Pride 5 | 28.9 | 26.1 | 25.2 | 80.3 |
| | Pioneer 3902 | 31.0 | 20.8 | 21.2 | 73.0 |
| 23/14 | Pride 5 | 25.6 | 31.0 | 29.9 | 86.4 |
| | Pioneer 3902 | 24.8 | 25.1 | 28.4 | 78.3 |
| 33/24 | Pride 5 | 15.5 | 21.3 | 23.6 | 60.4 |
| | Pioneer 3902 | 15.9 | 16.3 | 23.0 | 55.3 |
| Mean | Pride 5 | 23.3 | 26.1 | 26.2 | 75.7 |
| | Pioneer 3902 | 23.9 | 20.7 | 24.2 | 68.8 |
| LSD (0.05) | | NS ² | 2.0 | 1.7 | 5.5 |

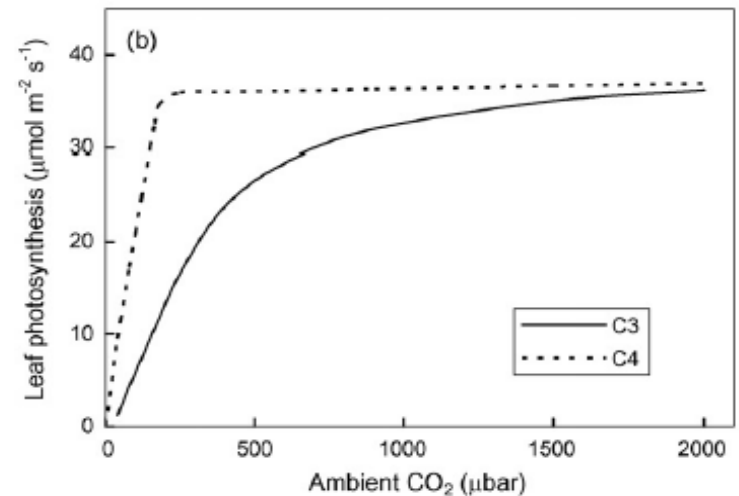
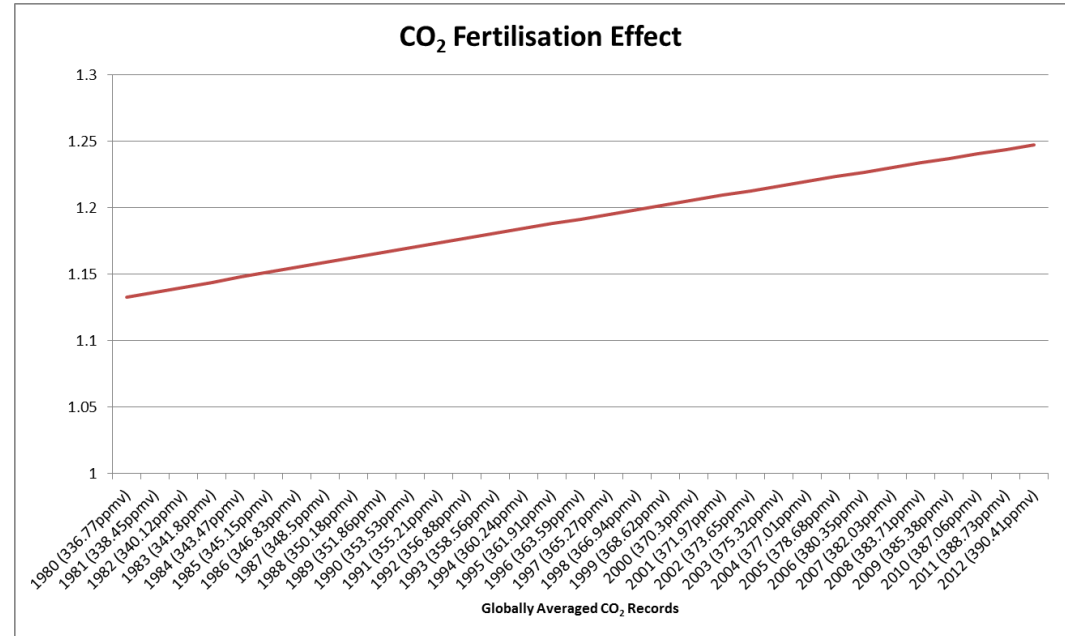
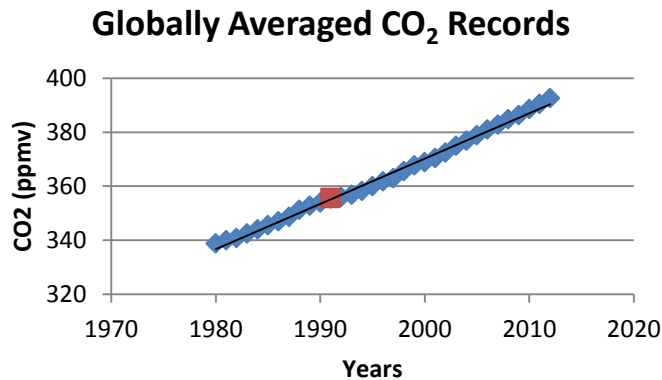
Source: Maize plants, Canada (Tollenaar et al. 1990)

| CO ₂ (μmol mol ⁻¹) | Temperature (°C) | Aboveground dry matter (g plant ⁻¹) |
|---|------------------|---|
| 370 | 19/13 | 149.1 ± 4.81 |
| | 25/19 | 112.2 ± 3.02 |
| | 31/25 | 116.0 ± 3.19 |
| | 35/29 | 102.2 ± 3.36 |
| | 38.5/32.5 | 75.1 ± 3.46 |
| 750 | 19/13 | 159.2 ± 2.85 |
| | 25/19 | 108.0 ± 3.02 |
| | 31/25 | 104.3 ± 3.35 |
| | 35/29 | 107.7 ± 7.63 |
| | 38.5/32.5 | 75.6 ± 4.85 |

Source: Maize plants, the USA (Kim et al. 2007)

Methodology

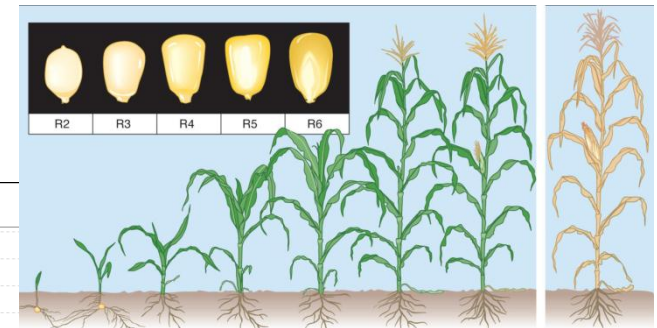
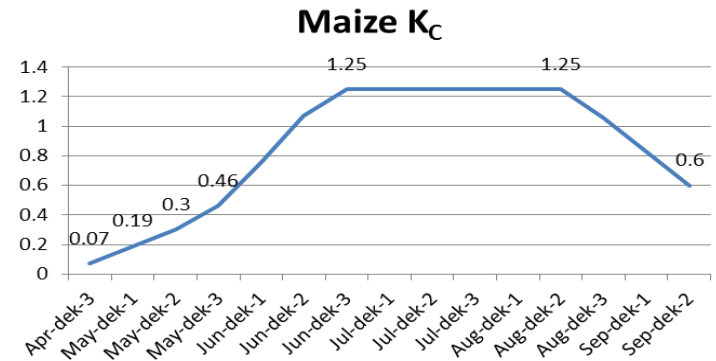
» ϵ_{CO_2} – CO₂ Fertilization Effect



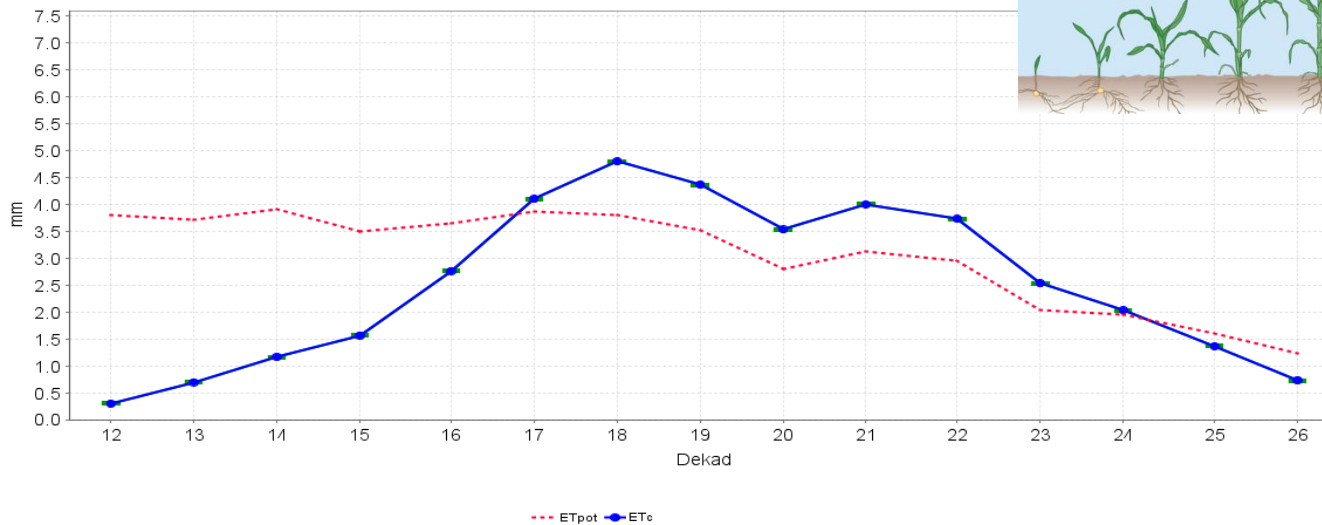
Source: Yin&Struik, 2009

Methodology

- » ϵ_{H_2O} – Water Stress Factor
 - » Carnegie-Ames-Stanford approach (CASA): $0.5 + 0.5 * ET_{ACT} / ET_C$
 - » ET_{ACT} calculated in AgroMetShell
 - » $ET_C: ET_{POT} * K_C$



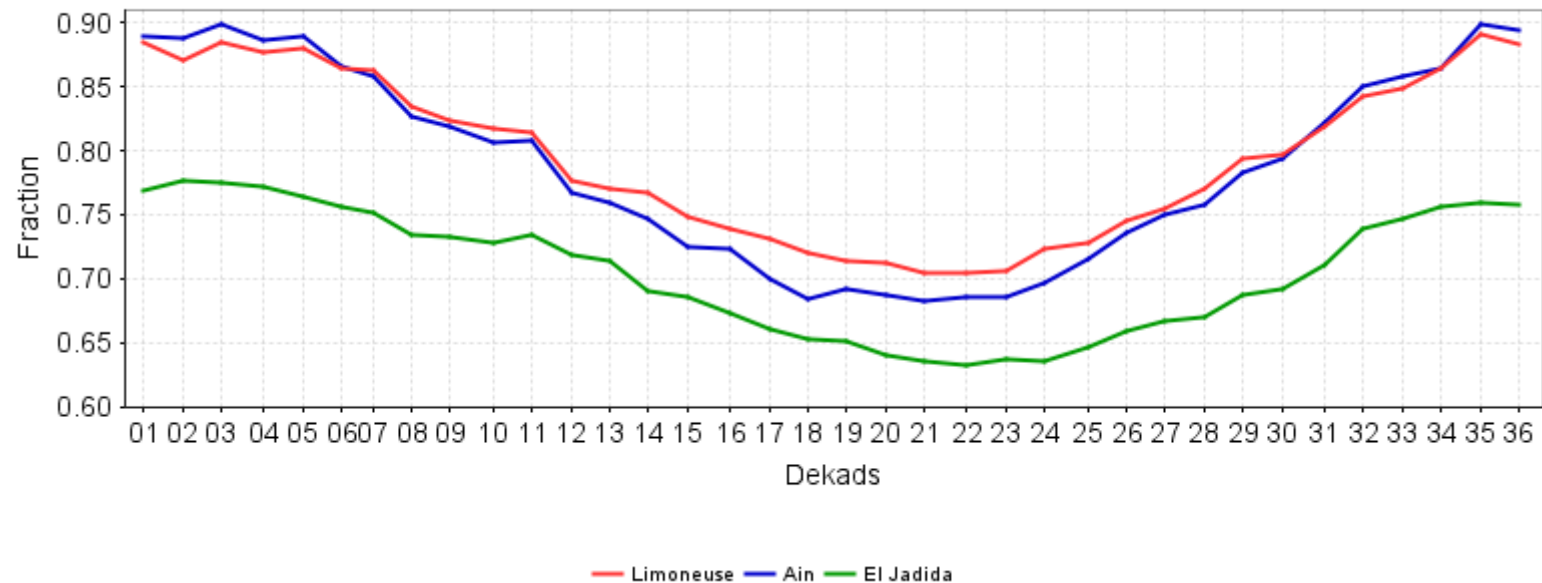
Sablonneuse - Vlaamse Zandstreek - 2004



Methodology

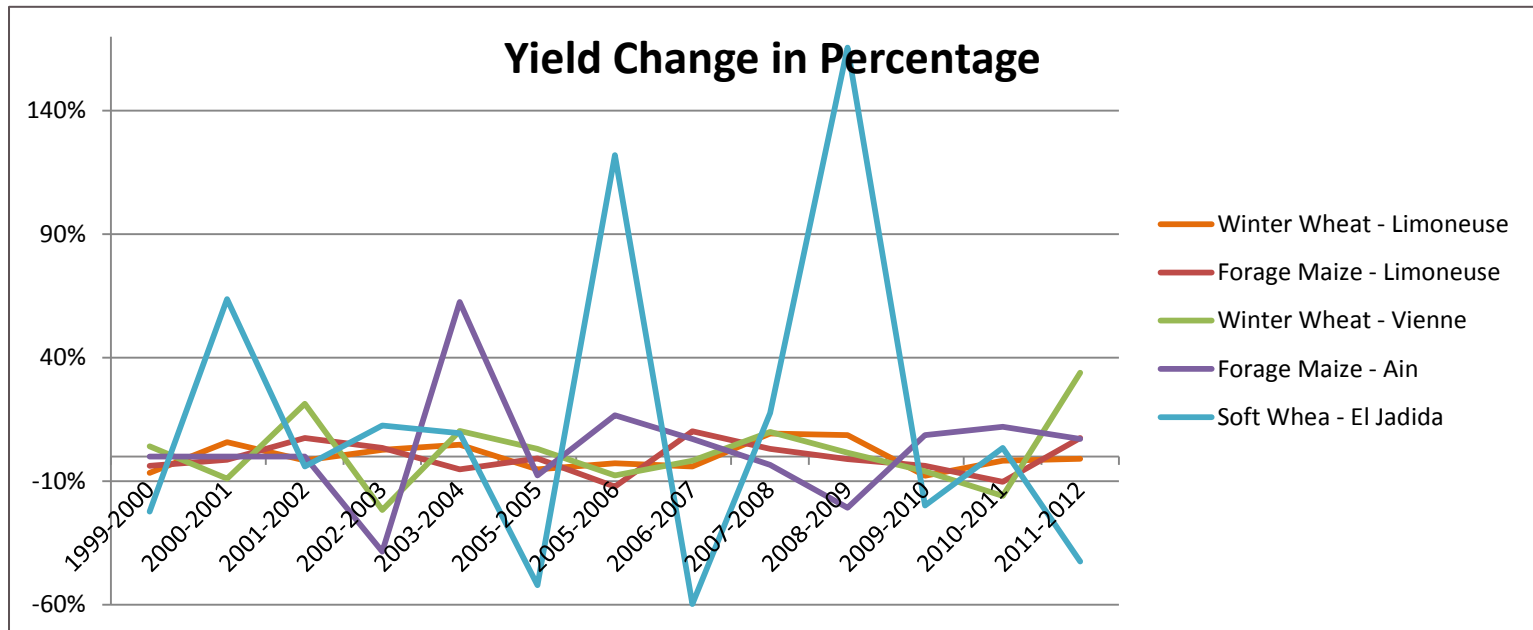
» ϵ_{AR} – The fraction kept after autotrophic respiration (1-AR)

Average 1999-2012



Results

- » A single linear regression between DMP (cumulated over an optimal temporal window¹) and actual yield statistics on a long term period (1999-2012) for forage maize and winter wheat.



¹ López-Lozano et al. 2013

Results

| Regions | Crop | Coefficient of Determination R ² | | | | RRMSE | | | |
|----------------|--------------|---|-------------|-------|------|--------------|--------------|-------|-------|
| | | Original DMP | New DMP | fAPAR | NDVI | Original DMP | New DMP | fAPAR | NDVI |
| Limoneuse (BE) | Winter wheat | 0.52 | 0.61 | 0.36 | 0.40 | 2.94 | 2.67 | 3.36 | 3.28 |
| Vienne (FR) | Winter wheat | 0.33 | 0.53 | 0.41 | 0.35 | 5.88 | 5.47 | 6.13 | 6.44 |
| El Jadida (MA) | Soft Wheat | 0.64 | 0.75 | 0.57 | 0.54 | 20.05 | 16.56 | 22.03 | 22.38 |
| Limoneuse (BE) | Forage maize | 0.37 | 0.55 | 0.35 | 0.32 | 4.50 | 3.78 | 4.54 | 4.68 |
| Ain (FR) | Forage maize | 0.40 | 0.85 | 0.78 | 0.84 | 5.33 | 5.13 | 6.14 | 5.22 |

Results

» Sensitivity Analysis: to understand which stress factor is more important

| | | Stress Factors | | |
|----------------|--------------|----------------|------|-----|
| Regions | Crop | CO2 | Temp | H2O |
| Limoneuse (BE) | Winter wheat | x | | x |
| Vienne (FR) | Winter wheat | x | | x |
| El Jadida (MA) | Soft Wheat | x | x | x |
| Limoneuse (BE) | Forage maize | | x | x |
| Ain (FR) | Forage maize | | x | x |

Conclusions, Limitations and Future Work

- » Conclusions:
 - » Adding water stress factor improved single linear relation
 - » For wheat, CO₂ and H₂O are the limiting factors for BE and FR; CO₂, Temp and H₂O are the limiting factors for MA
 - » For maize, Temp and H₂O are the limiting factors for BE and FR
- » Limitations:
 - » Low interannual yield variability in Belgium & France
- » Further work:
 - » Validation with flux-net data

THANK YOU