

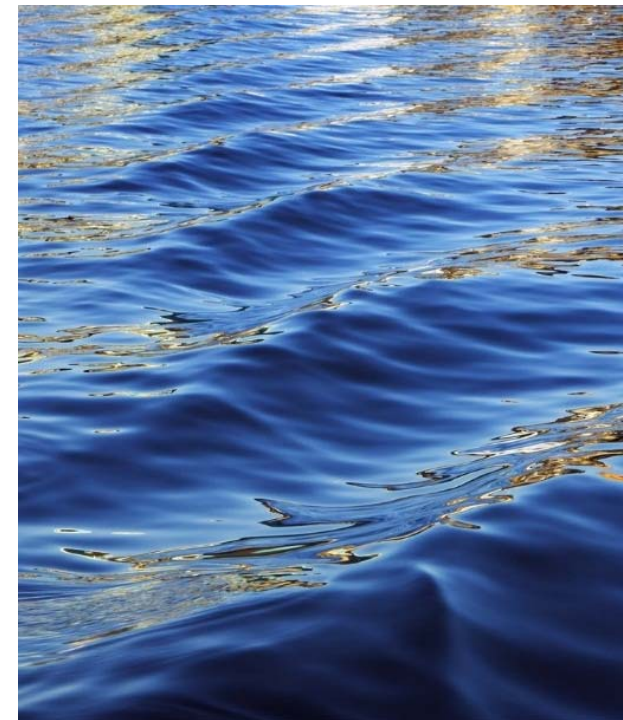


ILHAM-EC

# Mobility strand for teachers in Greece

Thessaloniki, 22-26 May 2017

Co-funded by the  
Erasmus+ Programme  
of the European Union





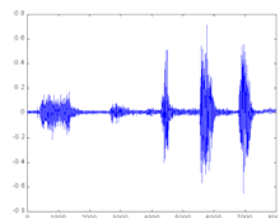
ΑΡΙΣΤΟΤΕΛΕΙΟ  
ΠΑΝΕΠΙΣΤΗΜΙΟ  
ΘΕΣΣΑΛΟΝΙΚΗΣ

# AGRICULTURAL Engineering laboratory





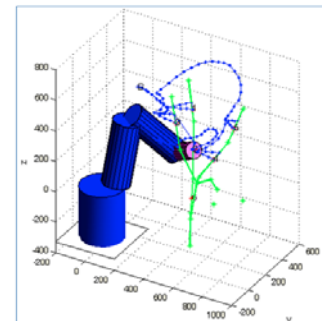
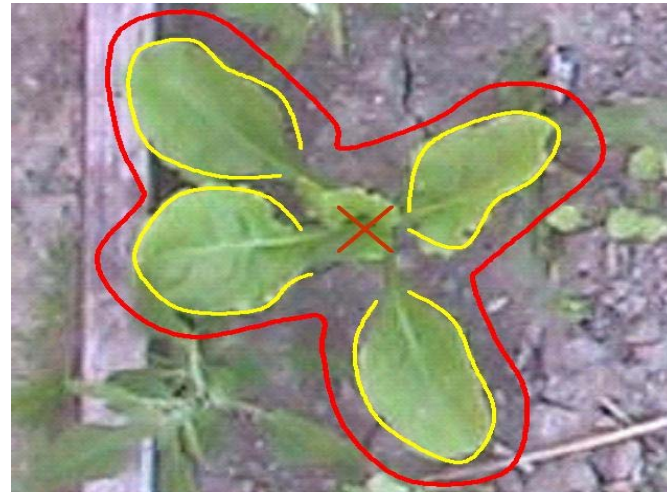
## Agro-Machinery





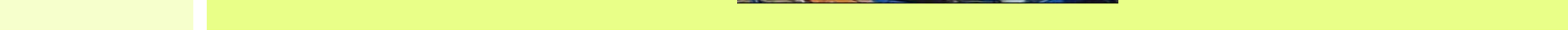
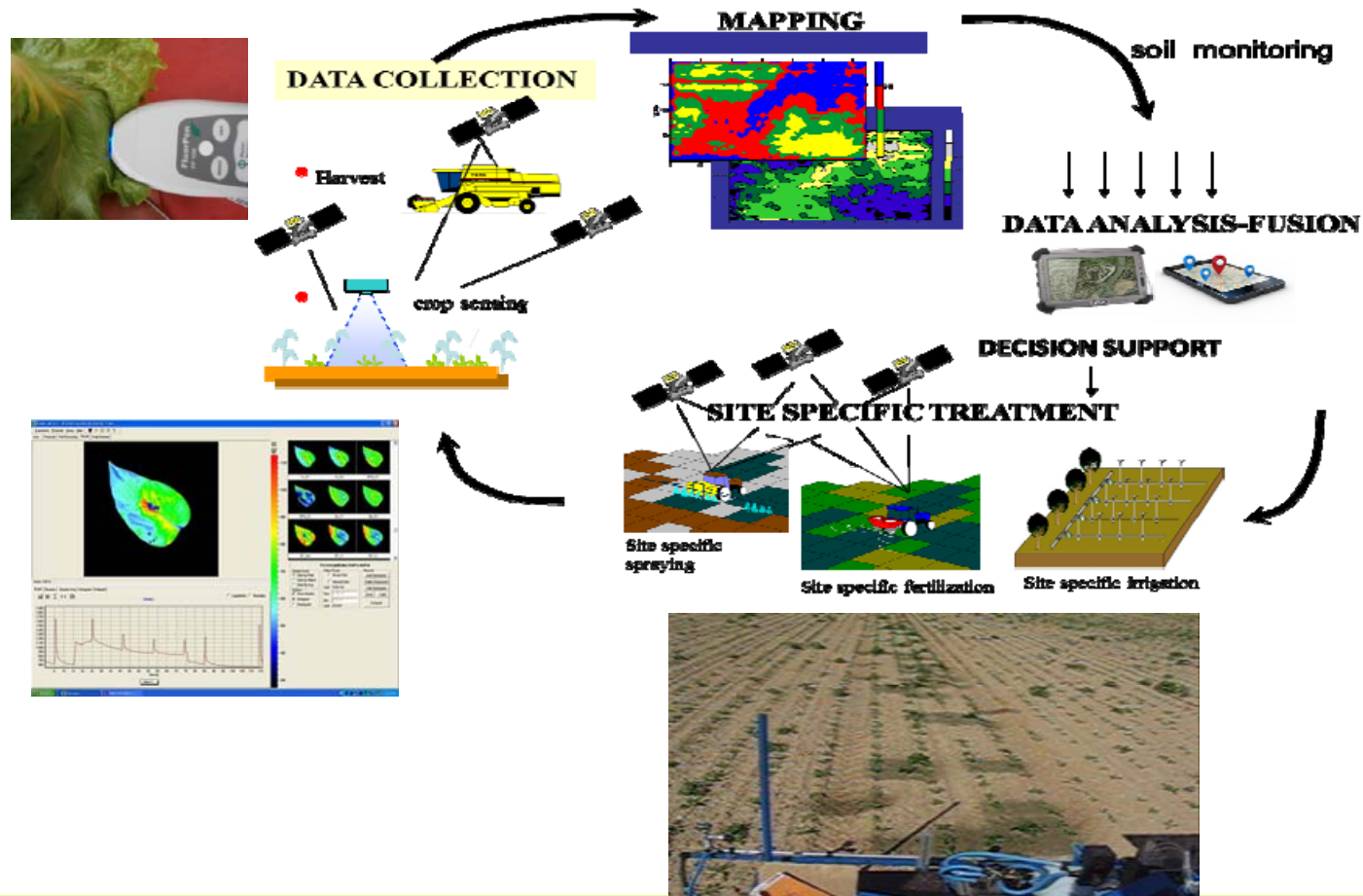


## Automation-Robotics-Machine Intelligence



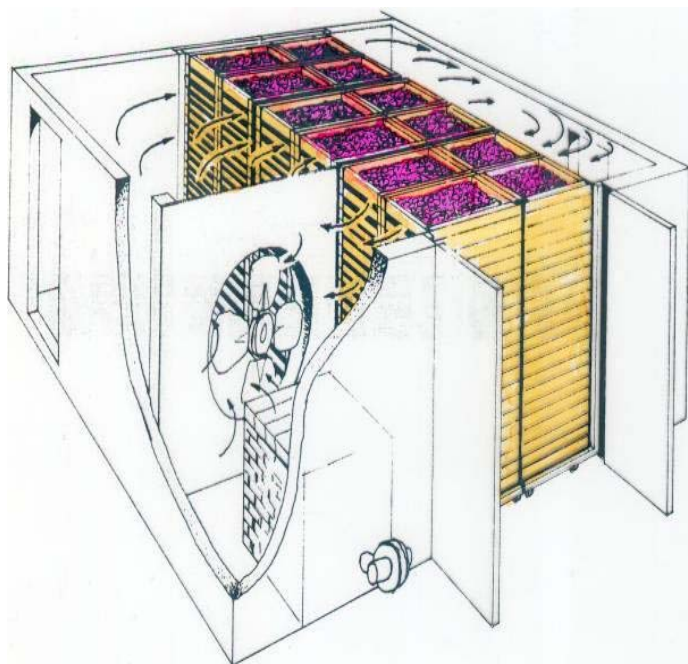


# Precision Agriculture-Sensors





## Post Harvest Handling–Drying -Quality







# Proximal sensing for biotic and abiotic crops stresses in precision agriculture

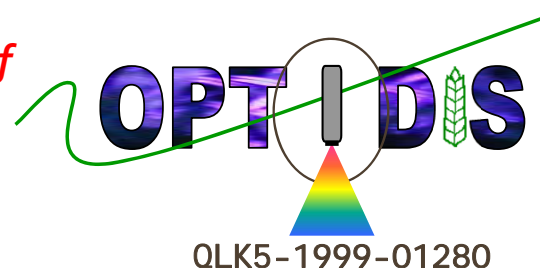
D. Moshou, X.E. Pantazi

*Aristotle University of Thessaloniki,  
- Agricultural Engineering Laboratory,  
Thessaloniki, Greece*

**AEL**



- *Intelligent autonomous system for the detection and treatment of fungal diseases in arable crops*



- *Active learning sensor fusion system for combined water stress and crop disease detection*







## overview

- Site-specific disease control
  - Biological background
  - 3 detection systems
  - Prototype
  - Spraying Strategy



## Disease Control

- Disease type
- Comparison of 3 disease detection techniques
  - Some biological background
  - Fluorescence
  - Spectral reflectance
  - Multispectral imaging
- A disease detection prototype
- Spraying strategy



## Disease Control



**Yellow Rust**



***Septoria tritici* (Leaf Blotch)**







## Site-specific treatments

### Site specific farming:

1. Apply fertilizers, herbicides and pesticides only where needed!
2. Reduction of production costs, reduction of chemicals
3. At the correct time (as early as possible)





## Disease Control

- Which are the best disease sensing methods?

- Look @ infection mechanisms!



## Disease Control



- Disease sensing methods

1. infection



- spores form hyphen
- hyphen penetrate stomata and cells

2. metabolic changes



- from photosynthesis to respiration
- nutrient flows

3. early senescence



- pigmentation and chlorophyll loss
- cell wall collapse

4. overall plant stress

- stomatal closure





### Infection mechanisms

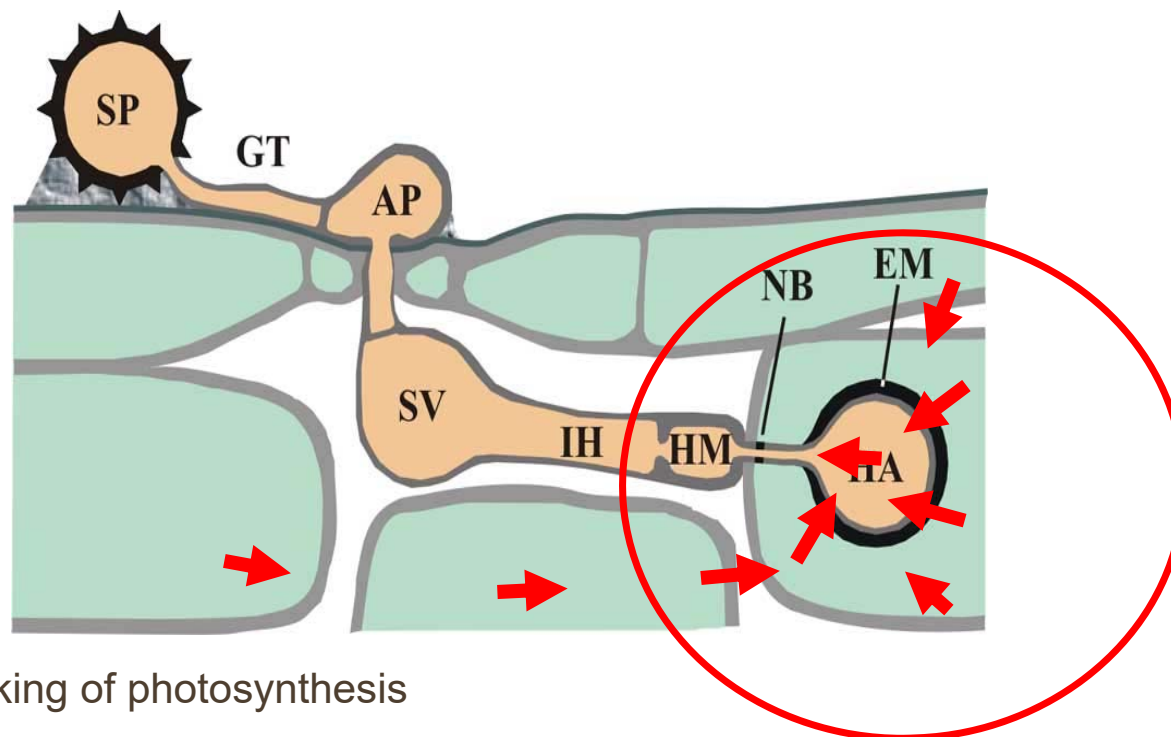
#### 1. infection





### ▬ Infection mechanisms

#### 2. metabolic changes



Blocking of photosynthesis



LOWER PS activity!!!!



### /// Infection mechanisms

#### 3. early senescence





## Disease Control



- Disease sensing methods

1. infection



2. metabolic changes



- on diseased parts
- from photosynthesis to respiration
- nutrient flows



*fluorescence*

3. early senescence



- on diseased parts
- pigmentation and chlorophyll loss
- cell wall collapse



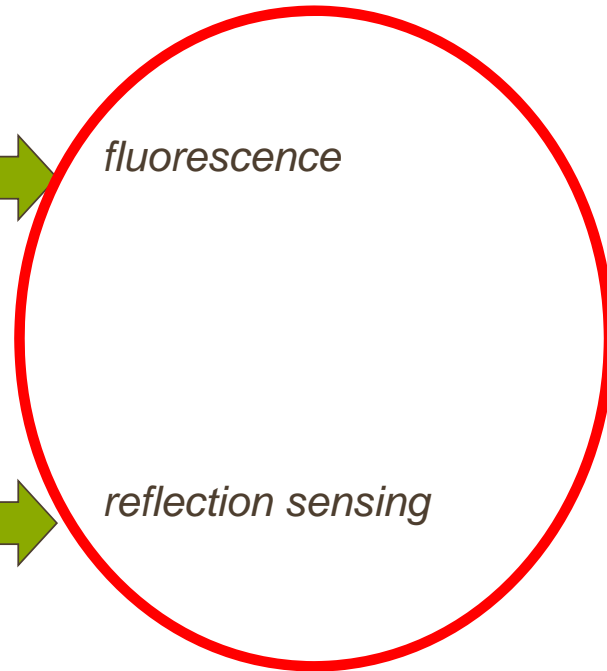
*reflection sensing*

4. overall plant stress

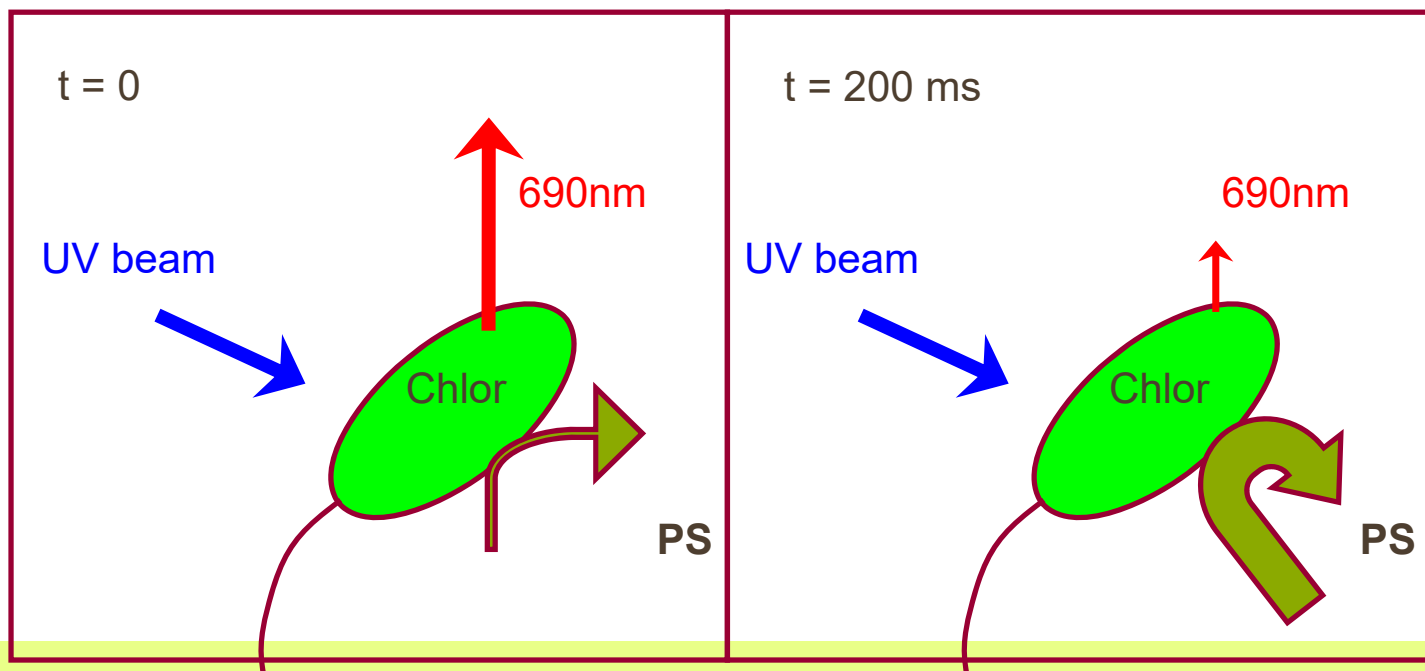
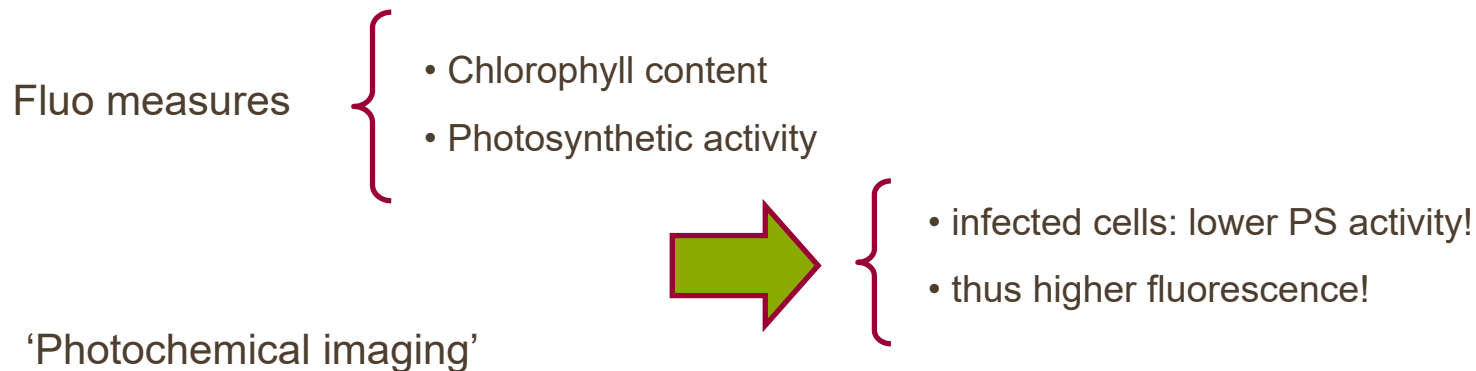
- stomatal closure



*thermography*



# Disease detection: Fluorescence imaging



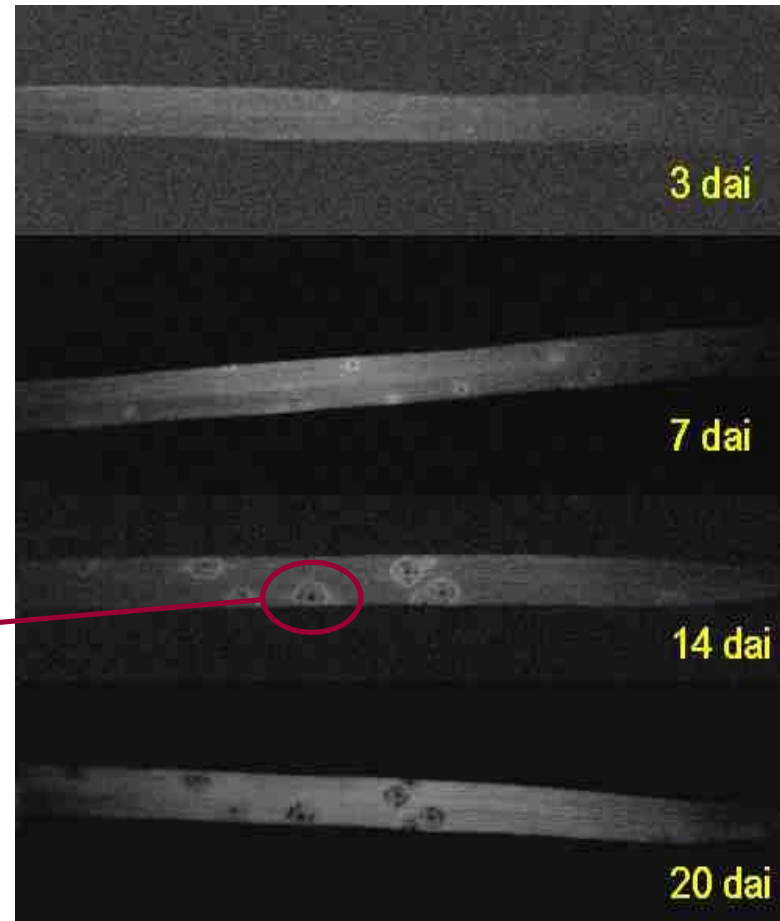


## Laboratory example

*Fluorescence at 690nm*

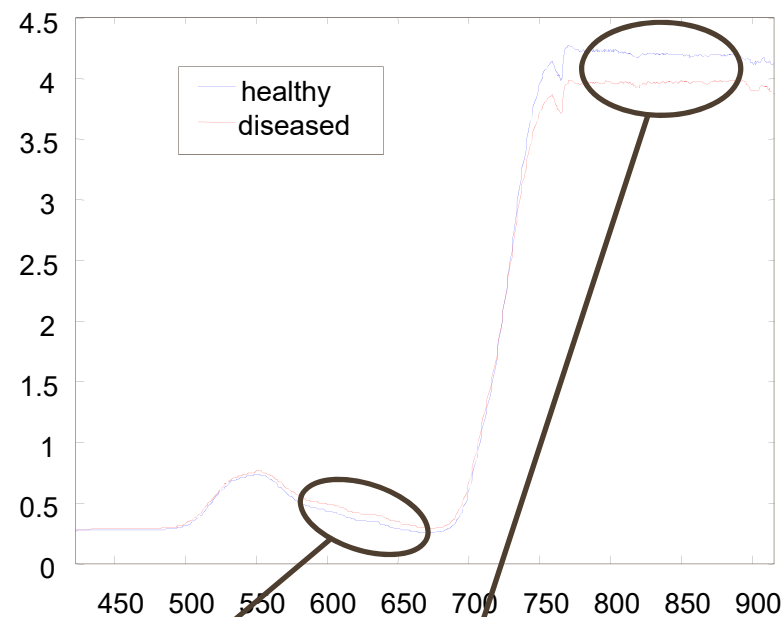
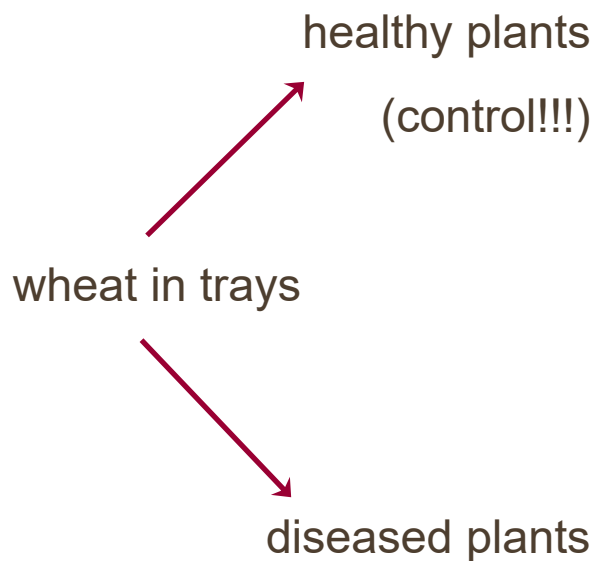
*Brown Rust infection*

suspected lesion





- Disease detection in greenhouse: Yellow Rust



$$StressIndex = \Delta spec(red) - \Delta spec(NIR)$$

## Disease detection: Spectral systems



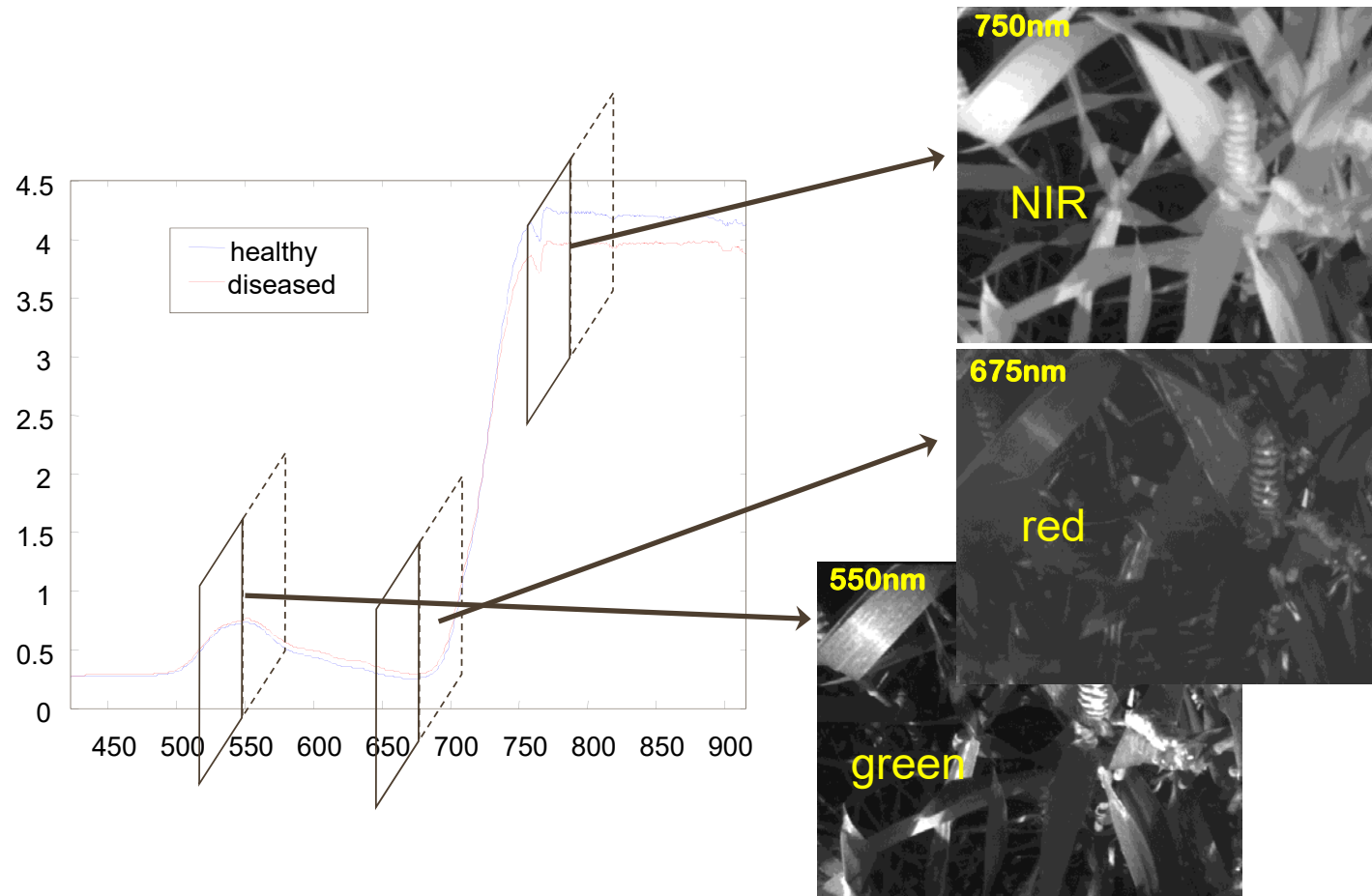
- Stress identification

$\Delta spec$	550nm (green)	550-620nm (yellow)	620-650nm (orange- red)	650-670nm (red)	>750nm (NIR)
<i>Septoria</i>	low	increasing	increasing	max	negative
<i>Yellow rust</i>	low	increasing	max	decreasing	negative
<i>Fertilizer deficiency</i>	max	decreasing	decreasing	low	negative





## Disease detection: Multispectral imaging





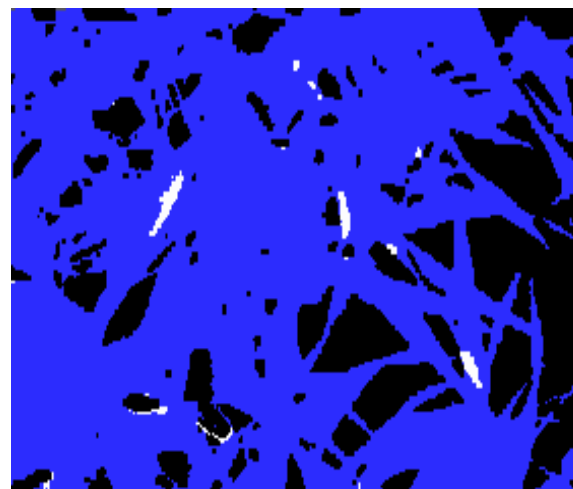
## Disease detection: Multispectral imaging

CIR image

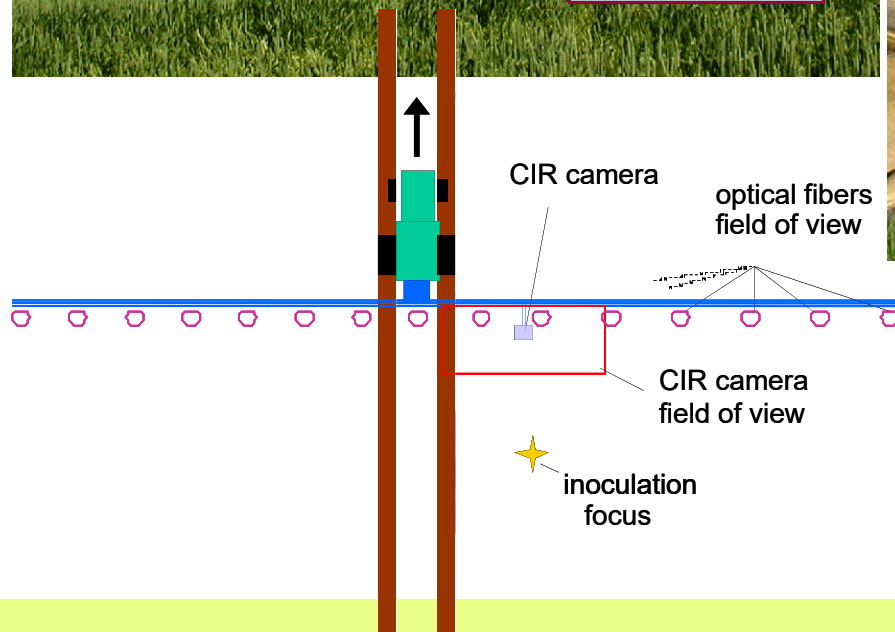
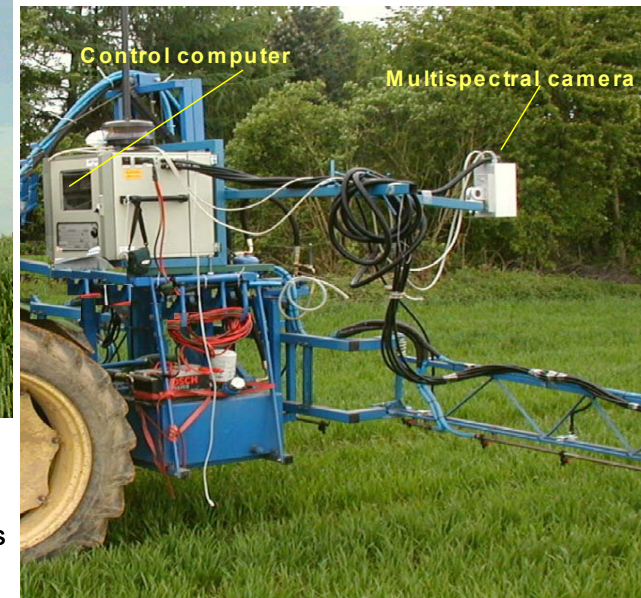
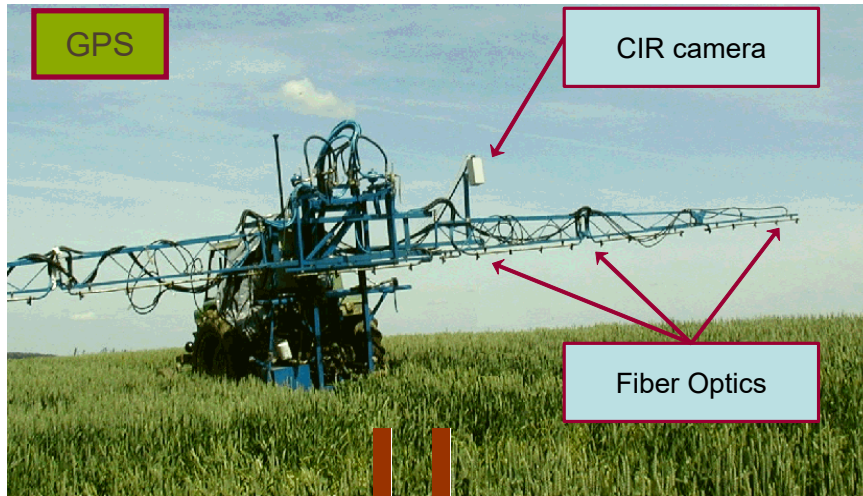


Not R-G-B  
but R-G-NIR!

Lesion image



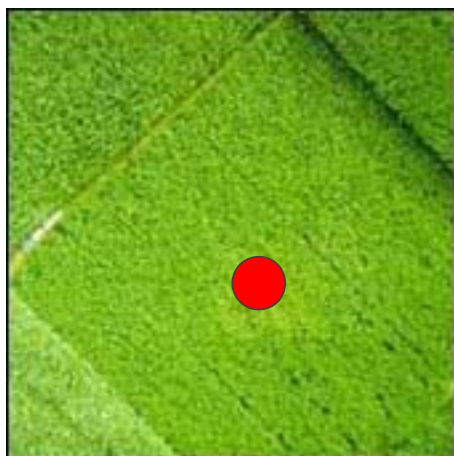
Lesion index =  
Nbr of lesions/leaf area



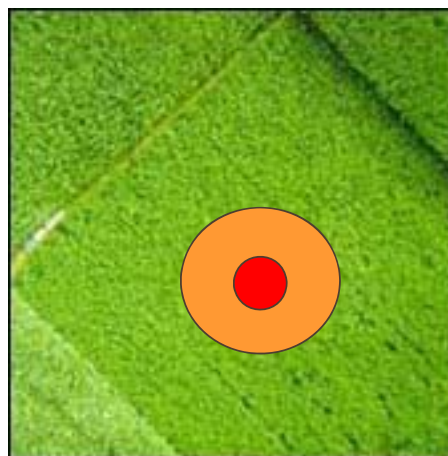
## Disease control: Spraying strategy



Optical detection



Epidemic model



Spraying  
recommendation  
map



- Estimate effective disease presence
- MAPPING approach is necessary (to apply epidemic model)
- Early detection means maximum reduction!



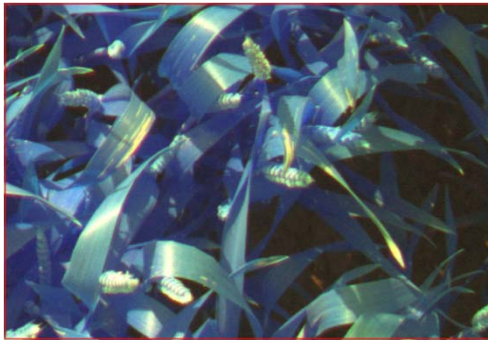
## Intelligent sensor fusion systems

- Sensor fusion is a method of integrating signals from multiple sources
- Information received from multiple-sensors is processed using "sensor fusion" or "data fusion" algorithms
- These algorithms can be classified into three different groups
  - probabilistic models (Bayesian reasoning, evidence theory, robust statistics, recursive operators)
  - least-squares techniques (Kalman filtering, optimal theory, regularization and uncertainty ellipsoids)
  - intelligent fusion (**neural networks**, fuzzy logic and genetic algorithms)– **feature based fusion**





## sensor fusion systems

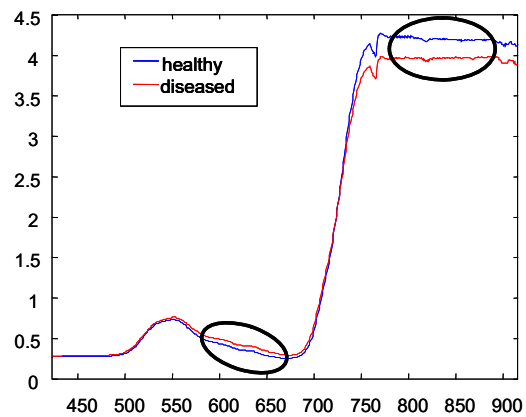


Lesion index = Nbr of lesions/leaf area

+

Spectral data between 450-900 nm were  
divided into 25 wavebands

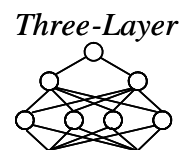
=



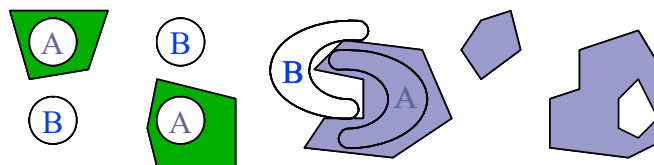


	Lesion Index (LI)	Wave band index	Error percentage
QDA	YES	NO	7.8
QDA	YES	3 17 22	6.6
NN	YES	3 17 22	5.9
QDA	YES	All 25	8.6
NN	YES	All 25	5.1

- Results of disease detection using a two hidden layer bayesian regularisation neural network with respectively 30 and 15 hidden neurons,
- NN: between 1 and 26 inputs (25 spectral bands and LI) and two outputs (diseased-healthy).



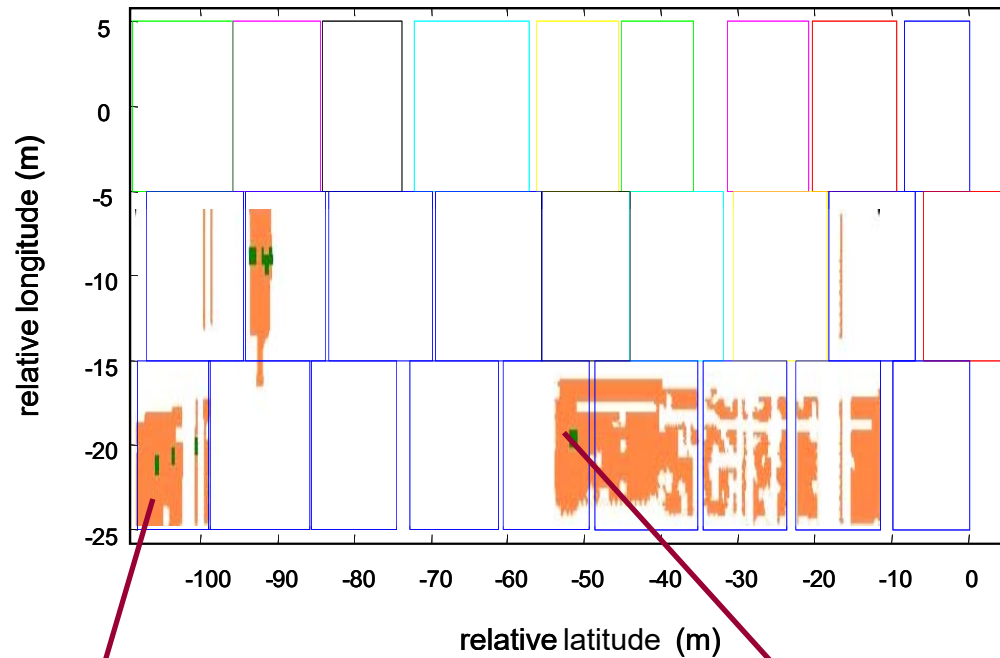
(Complexity  
Limited by No.  
of Nodes)





## Disease control: Spraying strategy

- Build a SPRAY-map
  - 1. detect disease (by prototype)



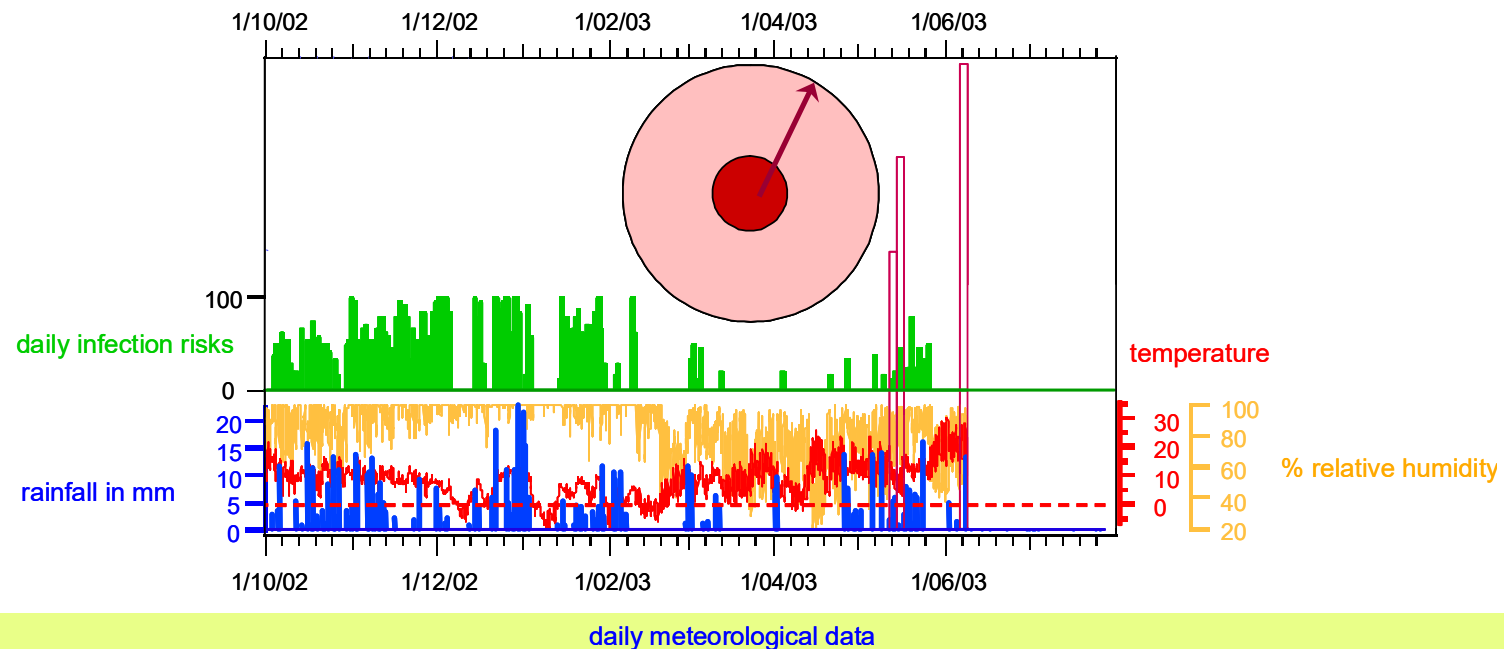
Measured area

Disease focus



## Disease control: Spraying strategy

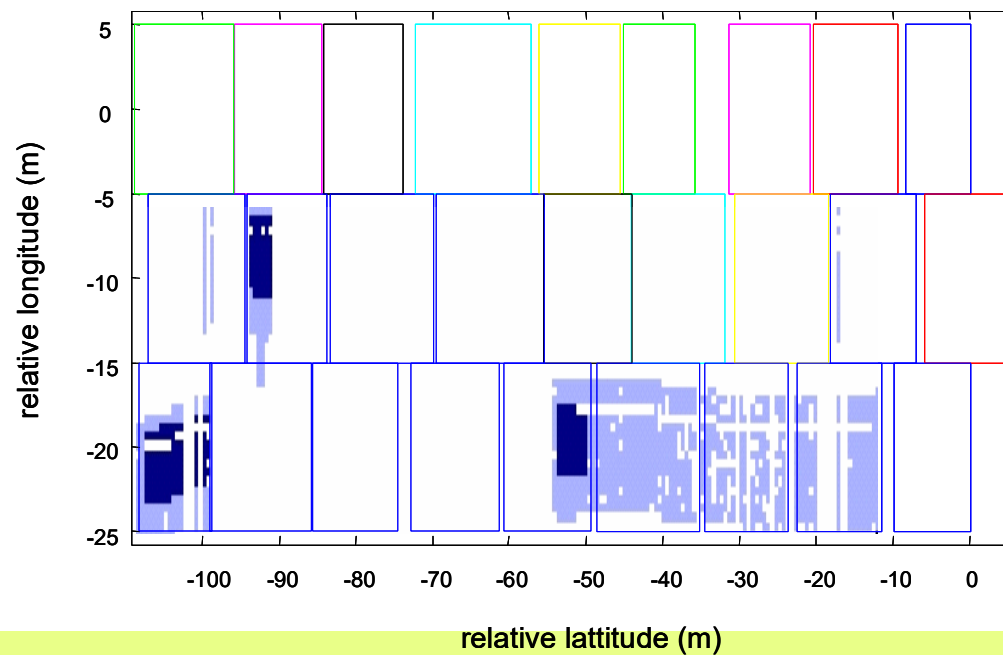
- Build a SPRAY-map
  - 1. detect disease (by prototype)
  - 2. use an epidemiological model service (internet)
  - 3. and calculate minimal protection radius





## Disease control: Spraying strategy

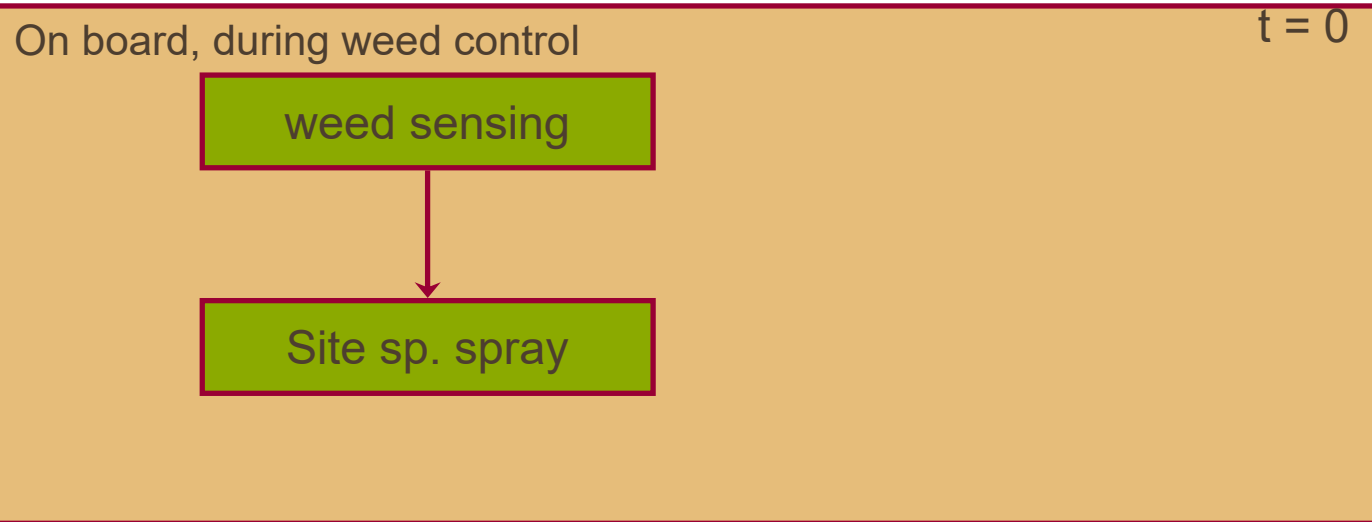
- Build a SPRAY-map
  - 1. detect disease (by prototype)
  - 2. use an epidemiological model service (internet)
  - 3. calculate minimal protection radius
  - 4. calculate a spray requirement map



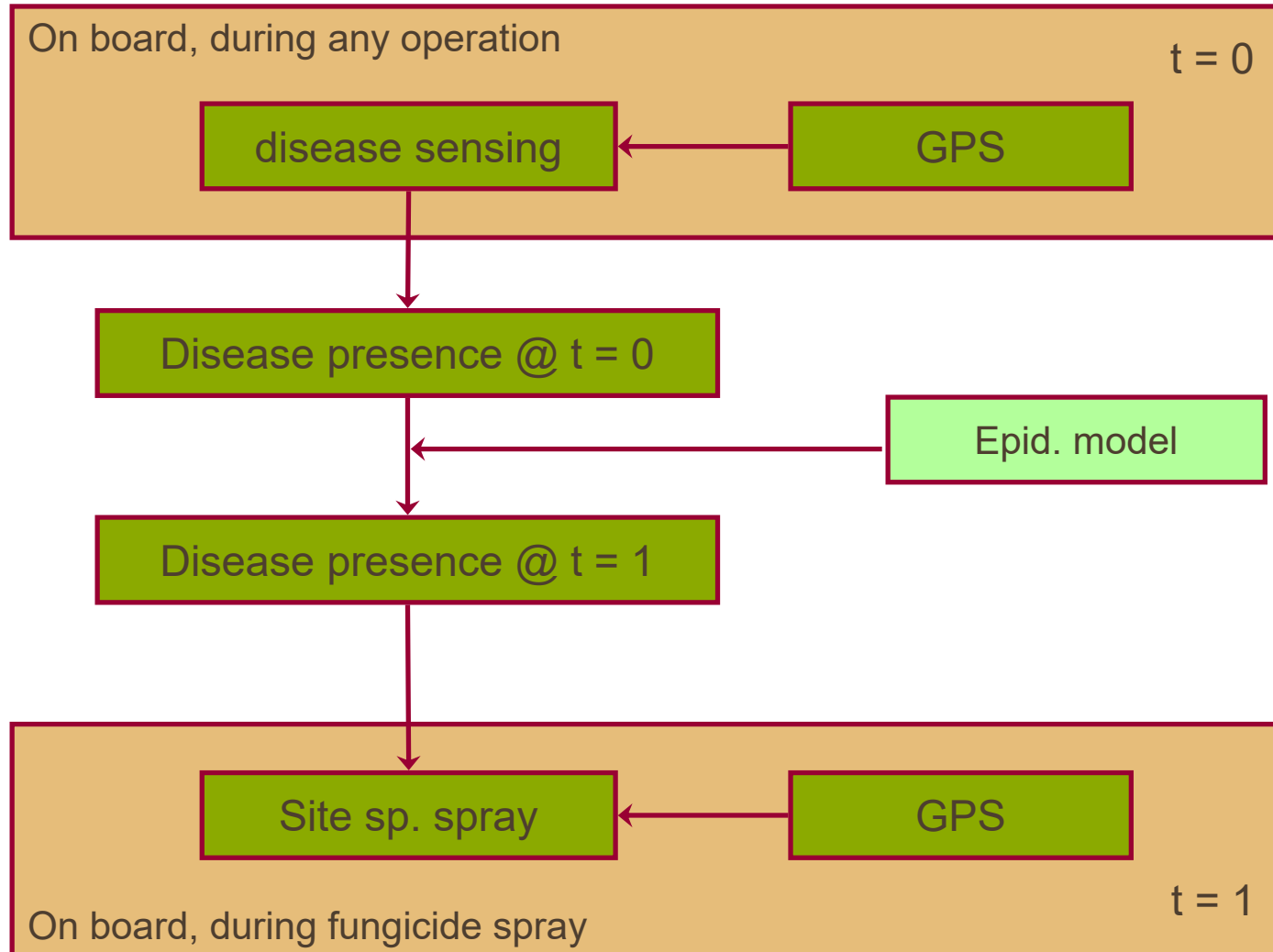




## Comparison with weed control



## Two passes needed





## Conclusions

- The functionality of automatic disease sensing and detection devices is crucial in order to conceive a site-specific spraying strategy against fungal foliar diseases.
- Due to their limitations, disease presence will be detected above a certain infestation threshold, and a certain infestation stage.
- Pre-visual disease assessment is only possible 3 to 7 days after infestation using fluorescence imaging. However this method was not practical in field circumstances.
- On the other hand, light reflection systems (spectral analysis and multispectral imaging) are only useful when the disease symptoms are visible.



## Conclusions

- In order to protect the field efficiently, the sprayer needs to know the spatial distribution of diseases during incubation.
- For radially propagated diseases, it is possible to determine a perimeter around a detected infection hazard using advanced epidemiologic models.
- These consider the disease presence above the detection threshold at the moment of detection and therefore estimate real disease presence. By combining this presence with meteorological data these models provide a minimal protection radius around the initially detected infection hazard.



## Conclusions

- As it is impossible to estimate effective disease presence during measurement, a two stage approach is proposed:
  - a. location of diseases during an earlier field operation
  - b. site-specific spraying when the effective disease presence is known.
- The example of this article shows in brief steps how the acquired spatially accurate disease detection data are efficiently processed towards practical spraying decisions.
- Highly accurate disease detection and infection estimation are therefore the most crucial and delicate parts of this process and to this end a multisensor data fusion system is a critical performance enhancing component.