

# Early detection of the fungal disease "apple scab" using hyperspectral imaging

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# Apple scab

- The main cause of stress and fruit losses in apple orchards .
- Fungal disease.
- Caused by the ascomycete fungus *Venturia inaequalis*.



- Requires 10 to 20 fungicide treatments applied per year on an orchard.
- Without treatments, it can **cause 100%** loss of the apple harvest.
- Best conditions for fungus development : **Temperature = 18°C et Humidity HR=90%**

- Attacks both **fruits** and **leaves**.
- Forms pale yellow or olive-green spots on the upper surface of leaves.
- Visible to the naked eye : **21 days** after infection



➤ Pressure to :

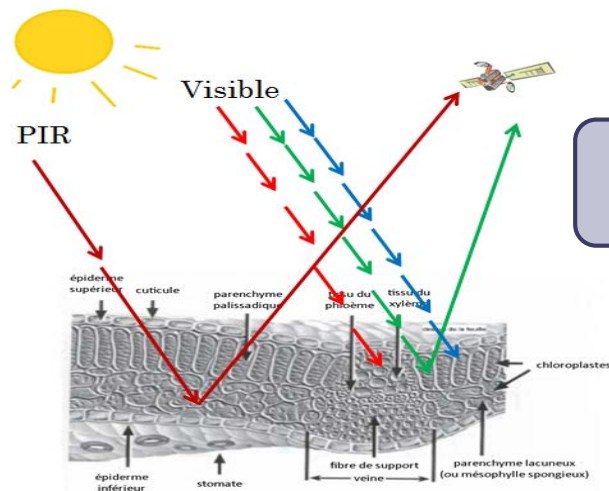
- ☐ Reduce pesticide use
- ☐ Reduce production costs
- ☐ Maintain a high level of crop quality

Early, accurate and non destructive detection of apple scab infection would be an efficient solution to optimize the management of the fruit disease

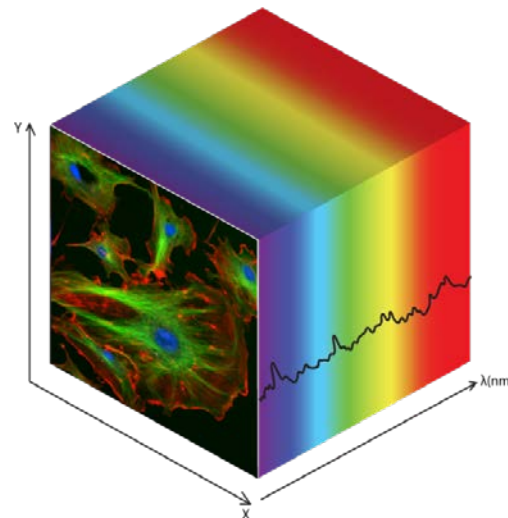


# Issues

- Fungal infections modify the reflectance spectral properties of infected leaf:
  - Delalieux.,al, 2007 → Spectroscopie (10 jours après l'inoculation)
  - Oerke et al., 2010 → Thermographie (Taches)

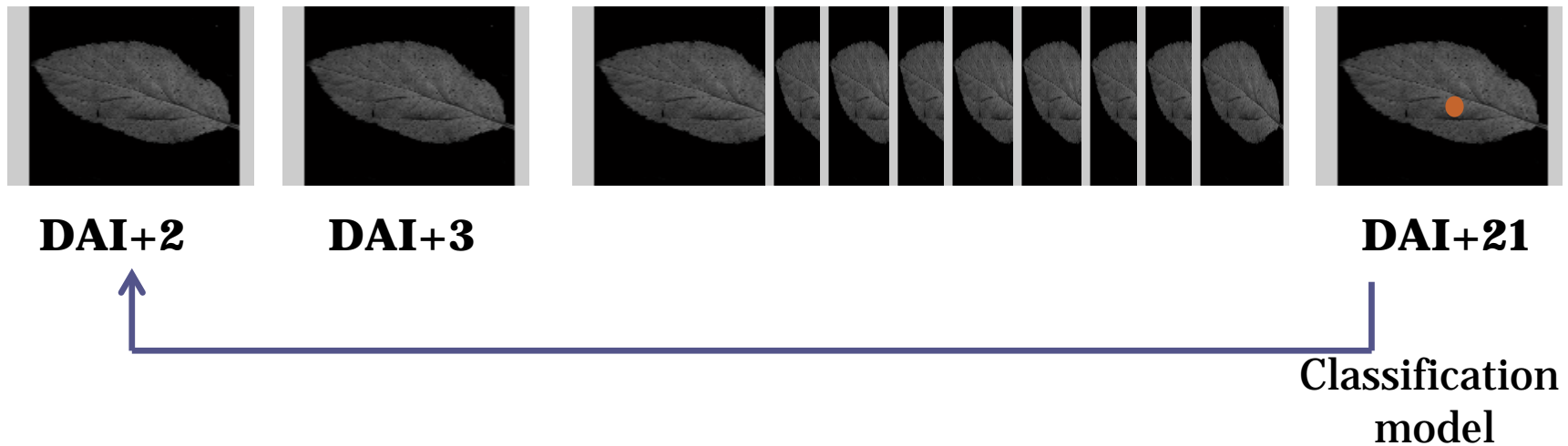


**Hyperspectral imaging:**  
Spectroscopie + image



# Assumptions

- Monitor the temporel and spatial evolution of the scab disease





# Experimental part



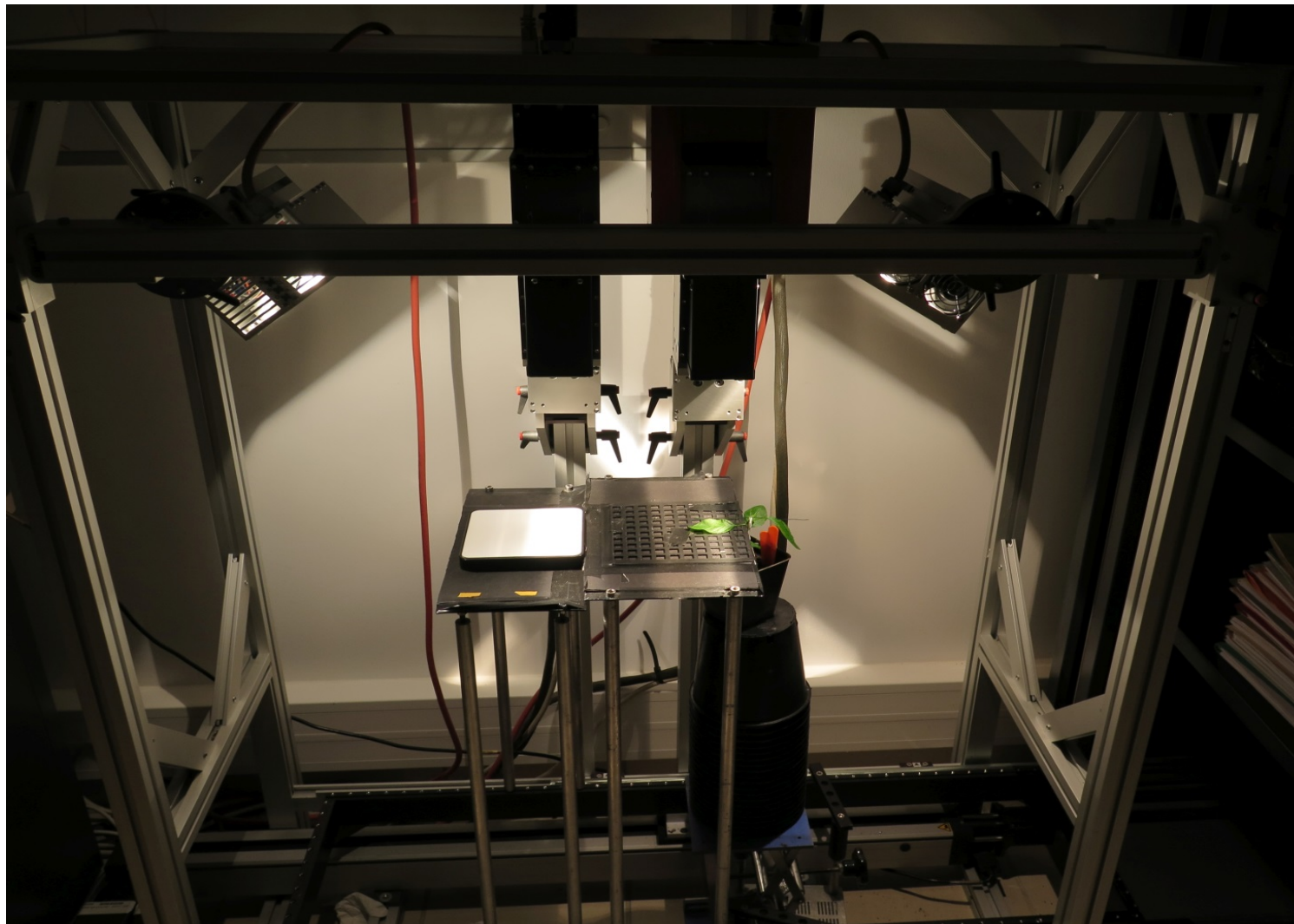
Greenhouse



Inoculation

Incubation

# Experimental part

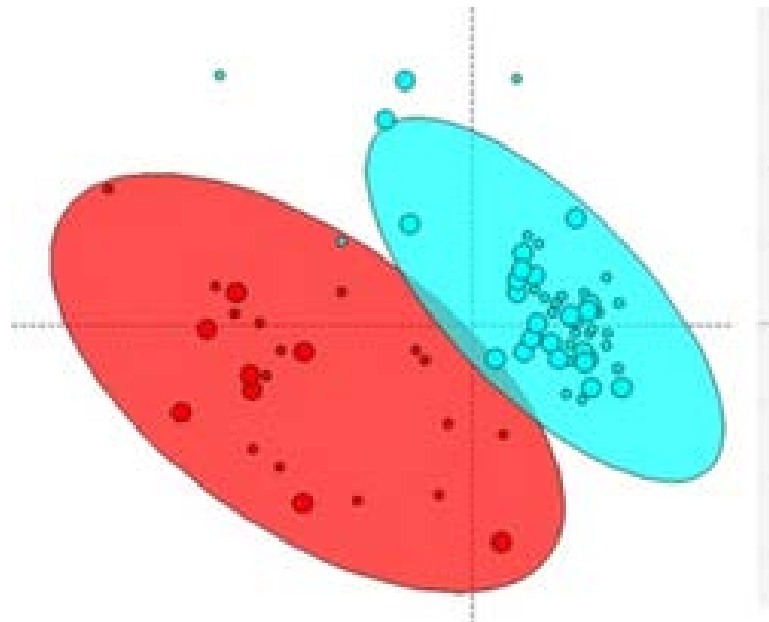


**Hyperspectral image acquisition device**

# Images processing

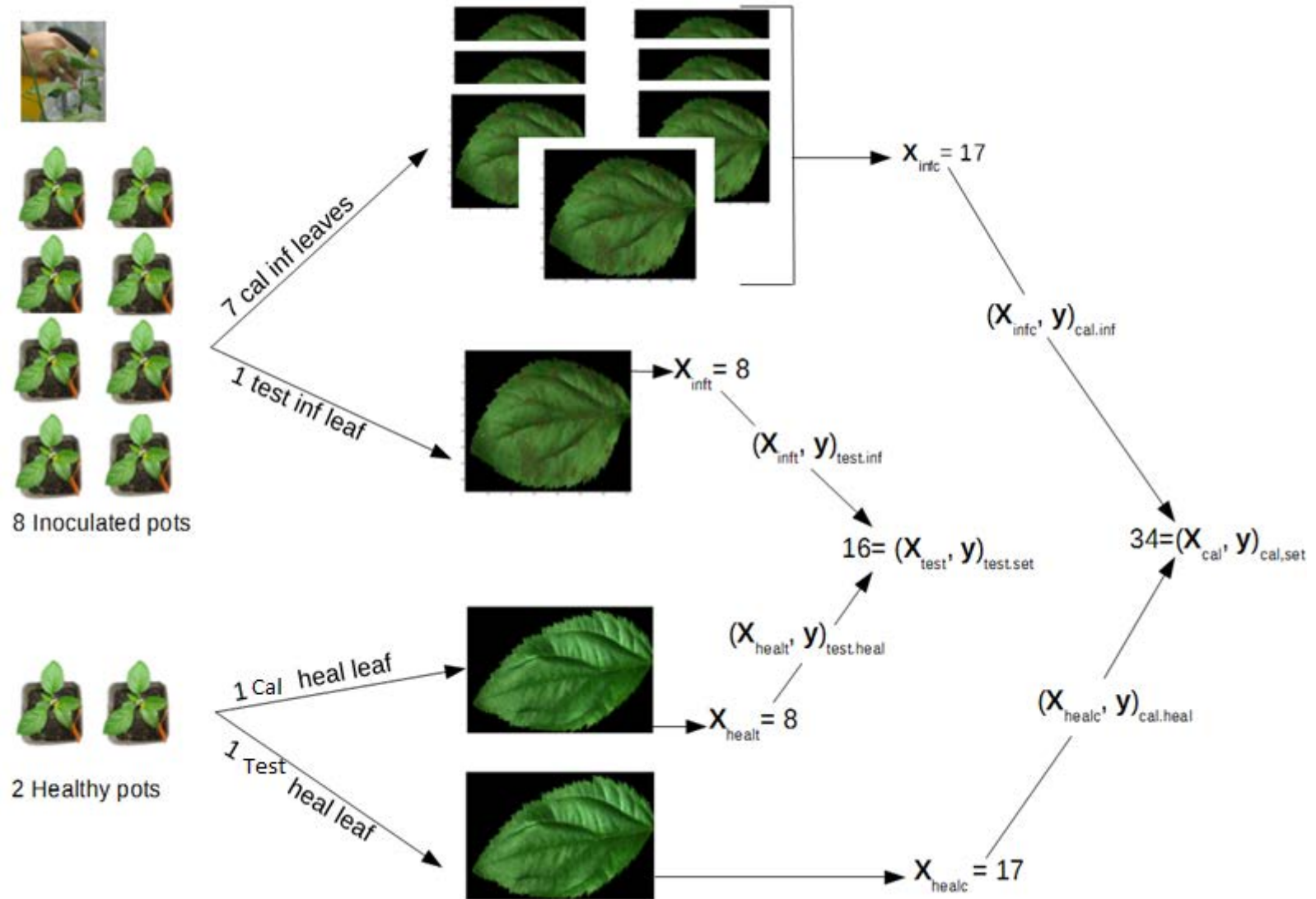
## ❑ Chemometric classification method PLS-DA :

- A PLS regression calculated between the spectra and their belonging degrees to the classes.
- Followed by a discriminant analysis DA calculated on the PLS scores.



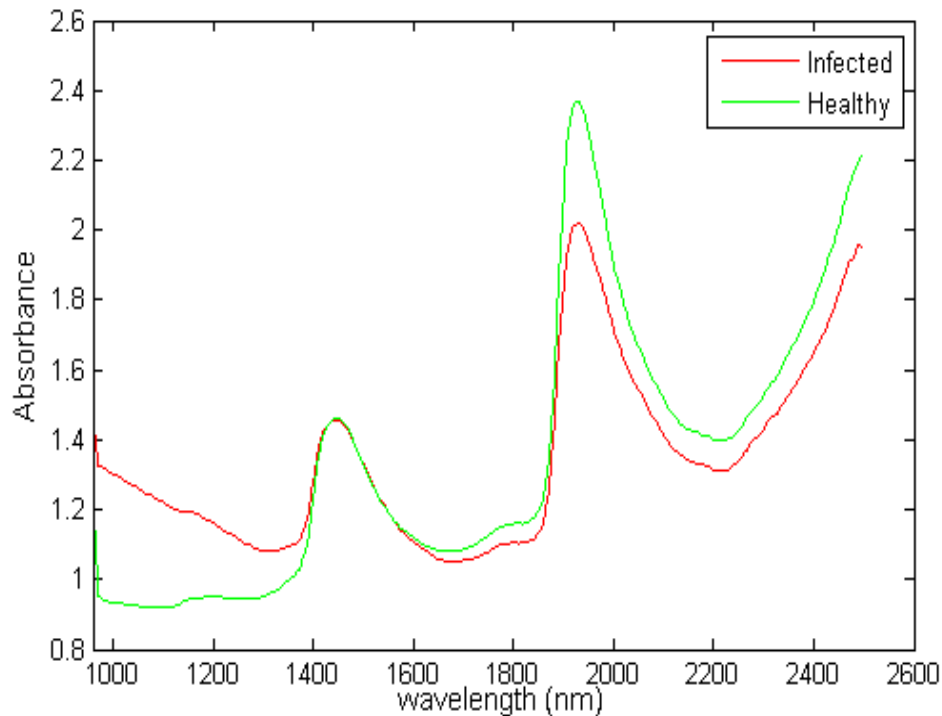


# Calibration and test sets



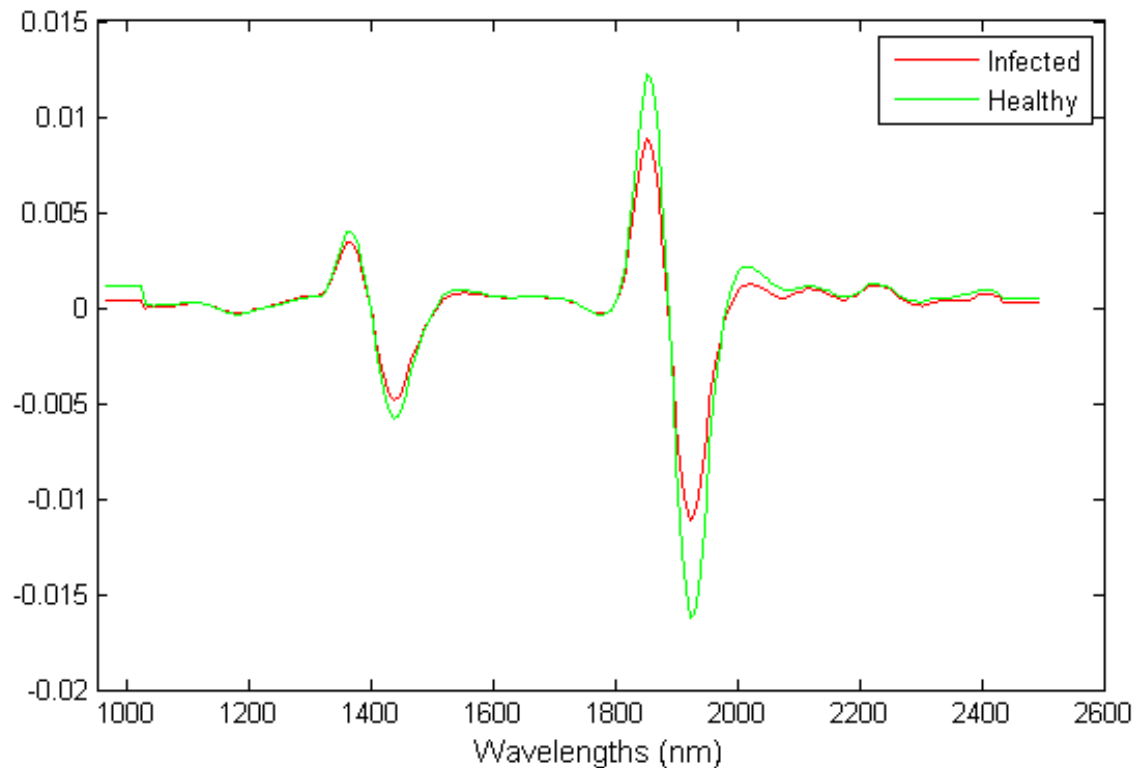
# Images processing

## Spectral analysis



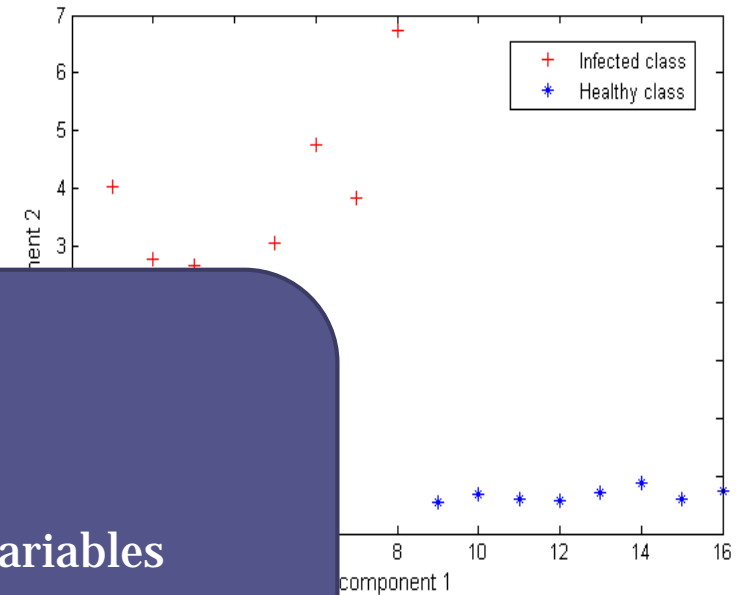
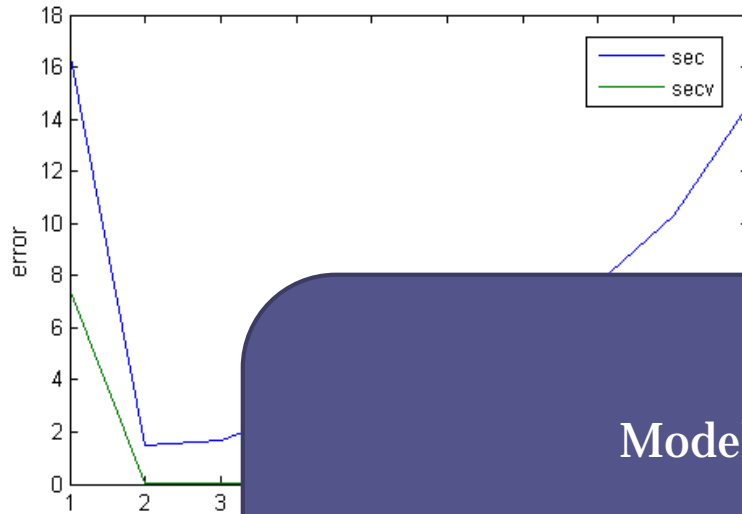
**Average spectral curve of  
healthy and infected classes**

# Images processing



**Second derivative of healthy and infected average spectra**

# PLSDA model



Model is valid

Simple model : 2 latent variables

Good predictability

		Predicted spectra	
Real classes	Infected test spectra	8	0
	Healthy test spectra	0	8

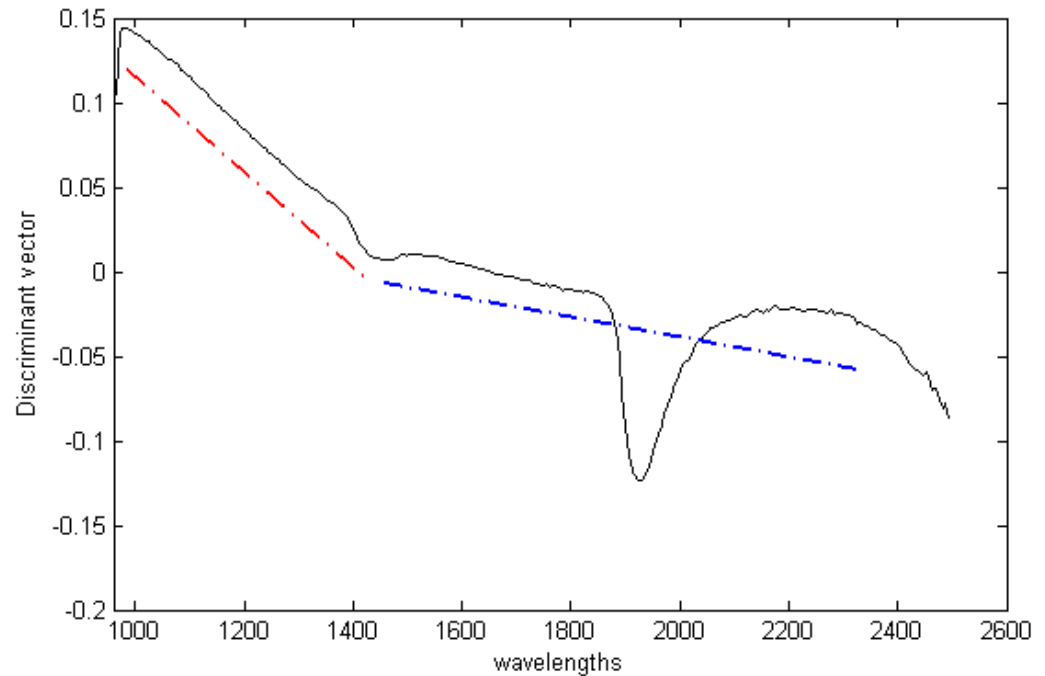
# Images processing

## Results :

Apple Scab:

Structure modifications

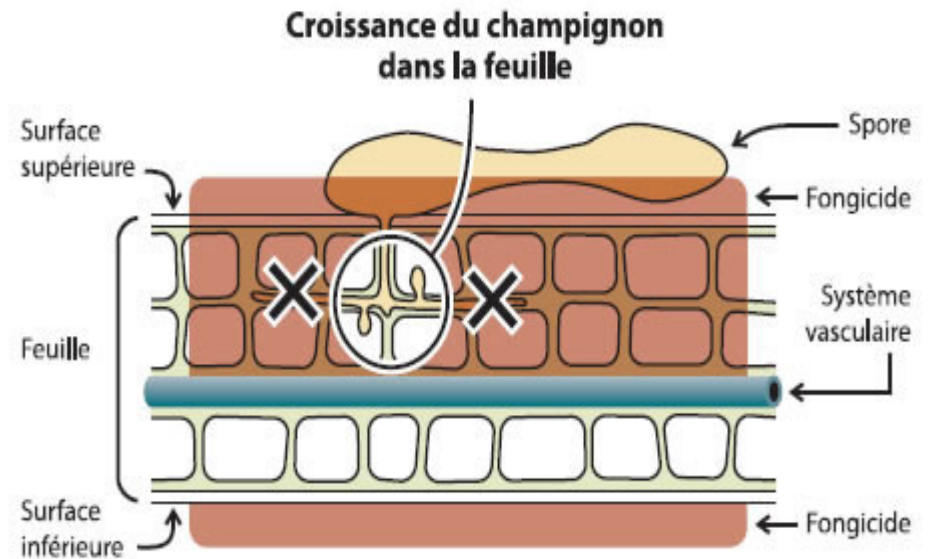
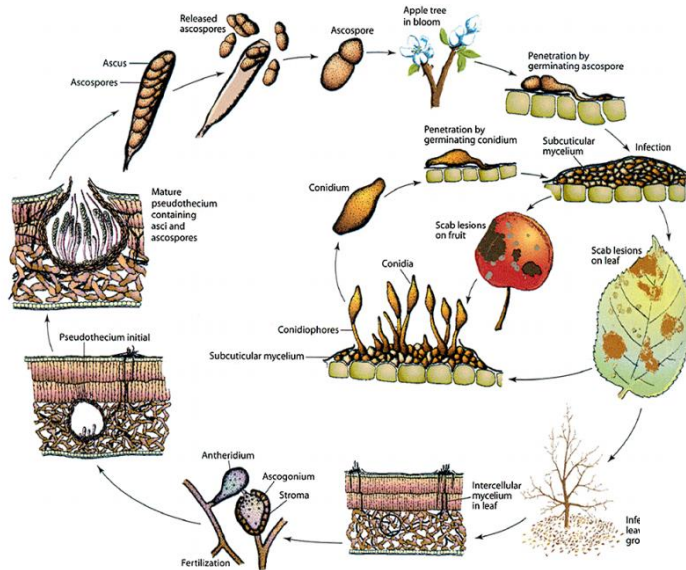
Water content



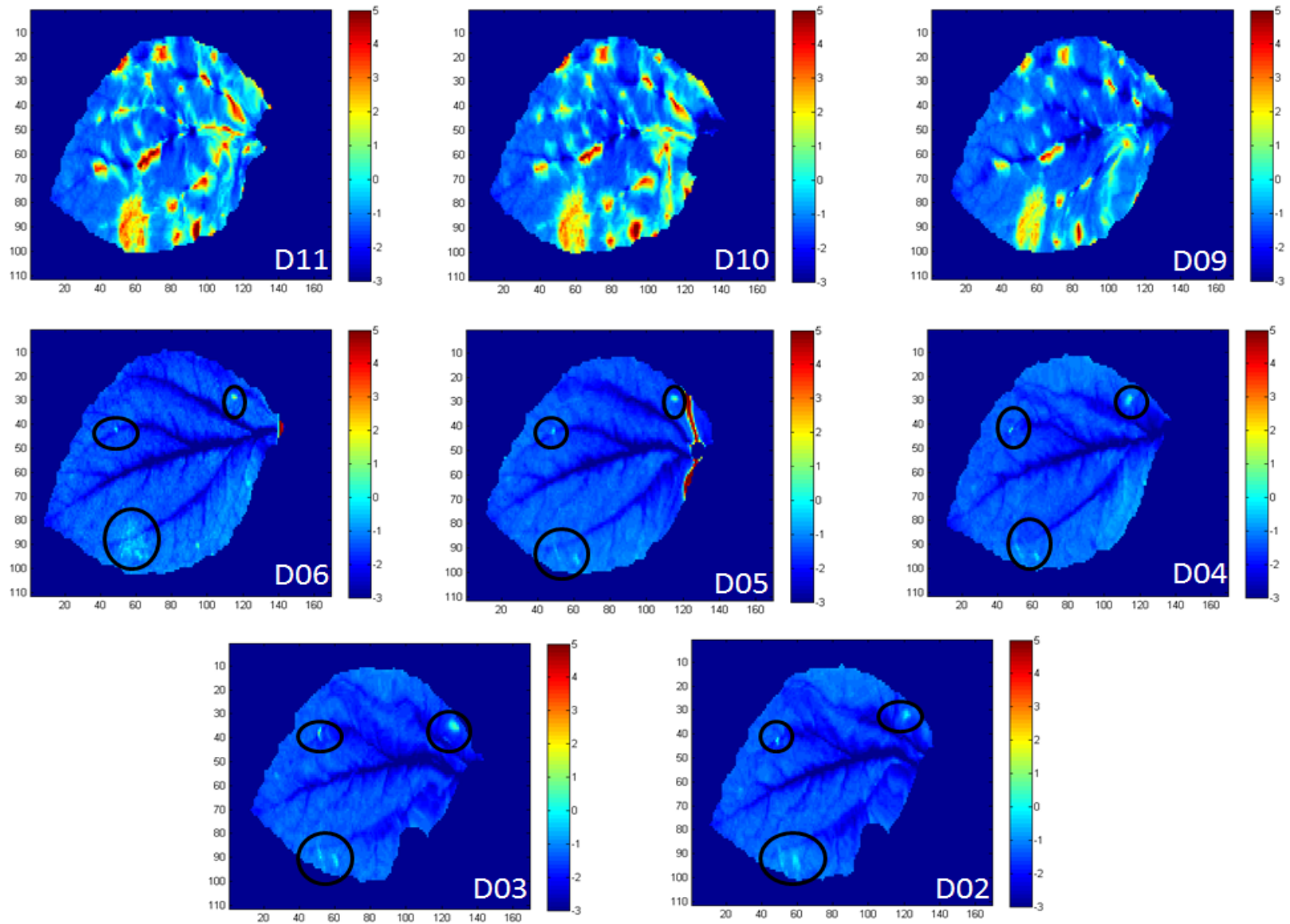
**PLSDA discriminant  
vector**



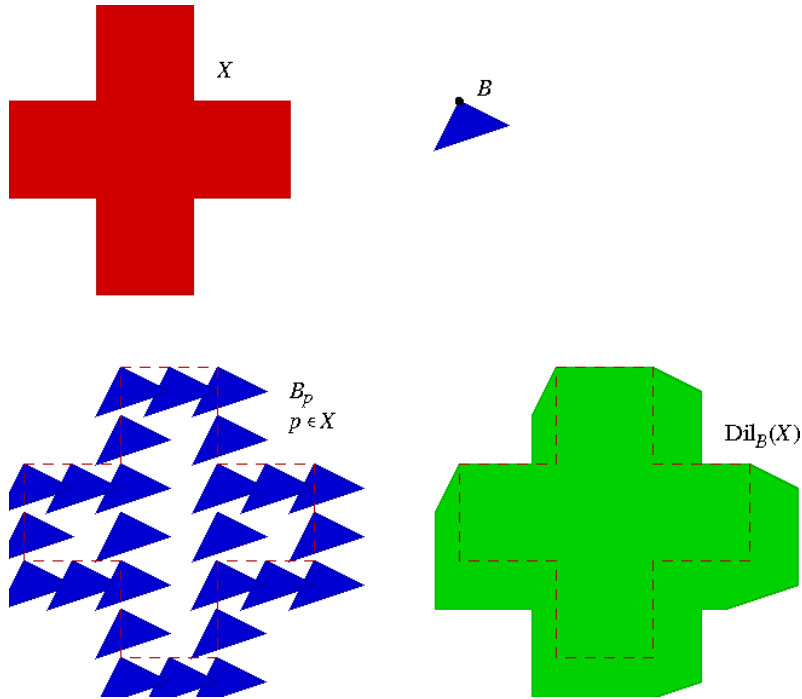
# Physiological link



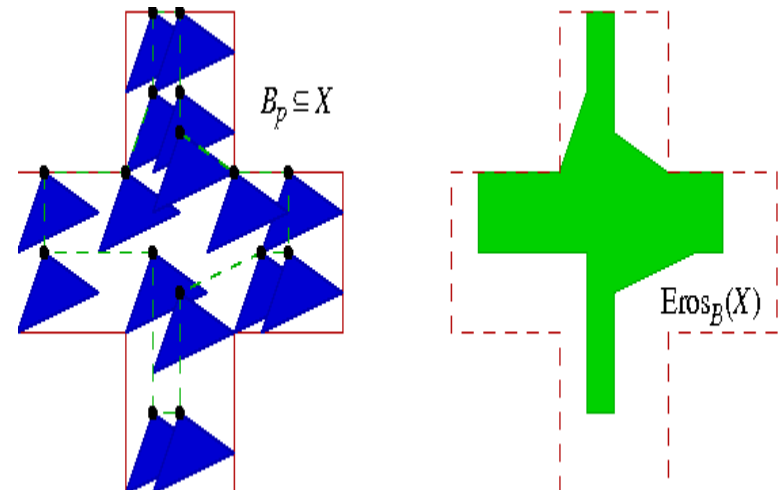
# Test of the PLSDA model on Infected leaf series



# Morphological operations

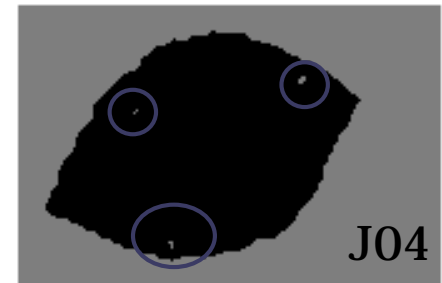
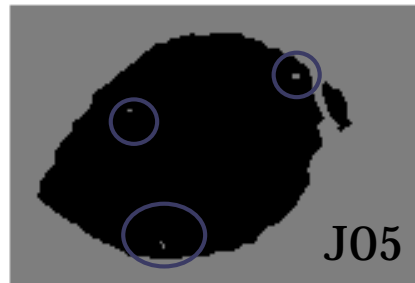
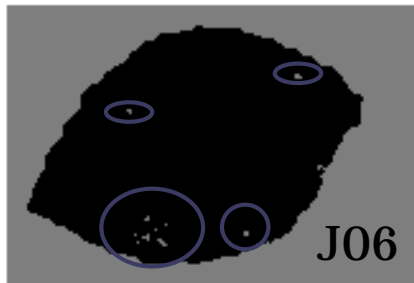


**Dilatation**

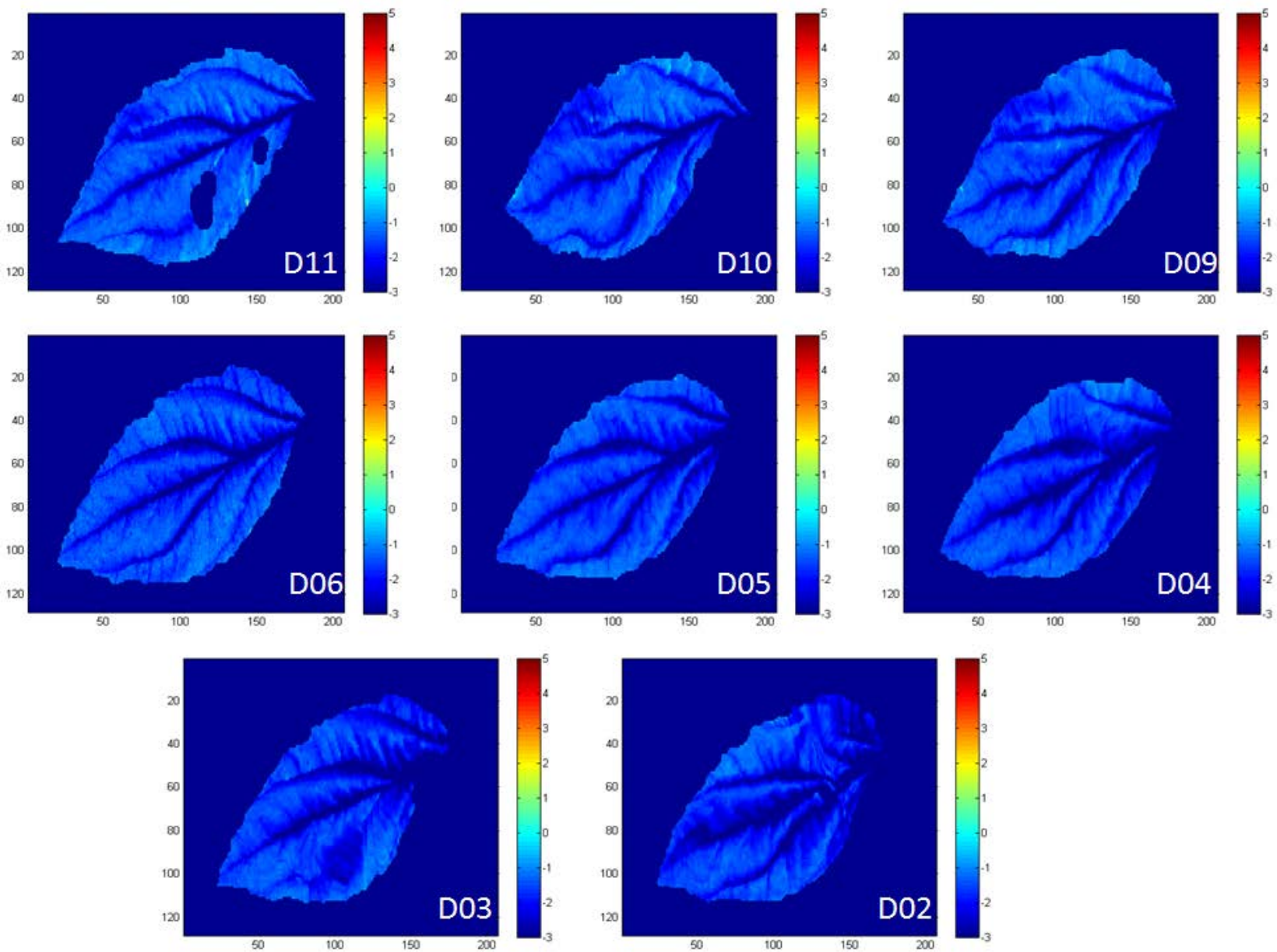


**Erosion**

# Opérations morphologiques ..



# Test of the PLSDA model on Healthy leaf series





# Morphological operations



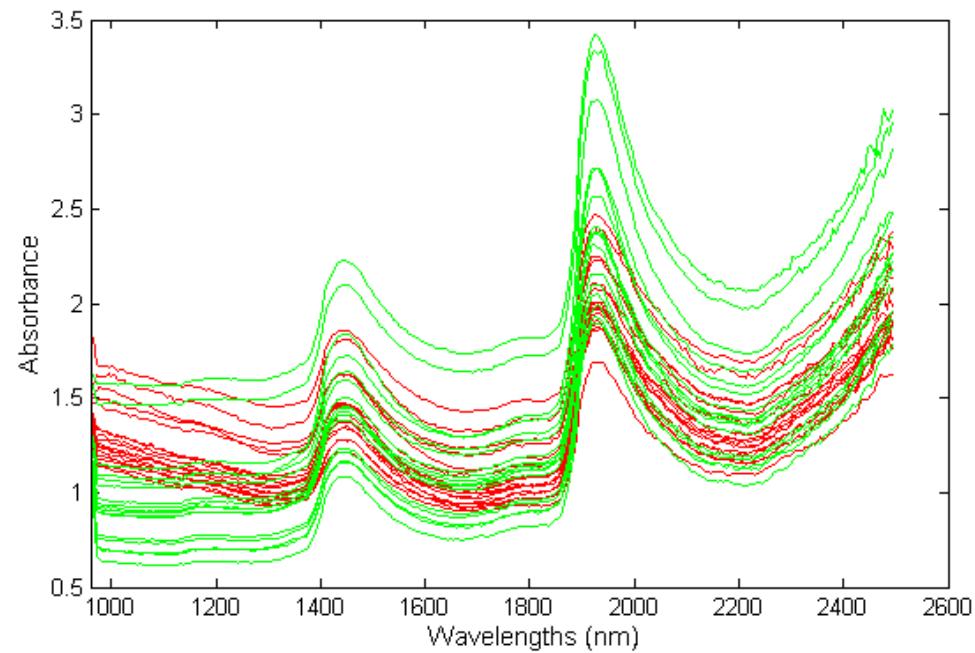
# Conclusions

- ❑ Hyperspectral imaging offers high potential as a non-invasive detection tool of apple scab infection.
- ❑ The most important disease effect is a change in the leaf physical structure
- ❑ The infection has a specific influence on reflectance spectra zone between 1950 nm: Zone carrying information on water content.
- ❑ SWIR (1000nm\_2500nm) is adapted for the early apple scab detection.

# Thank you for your attention

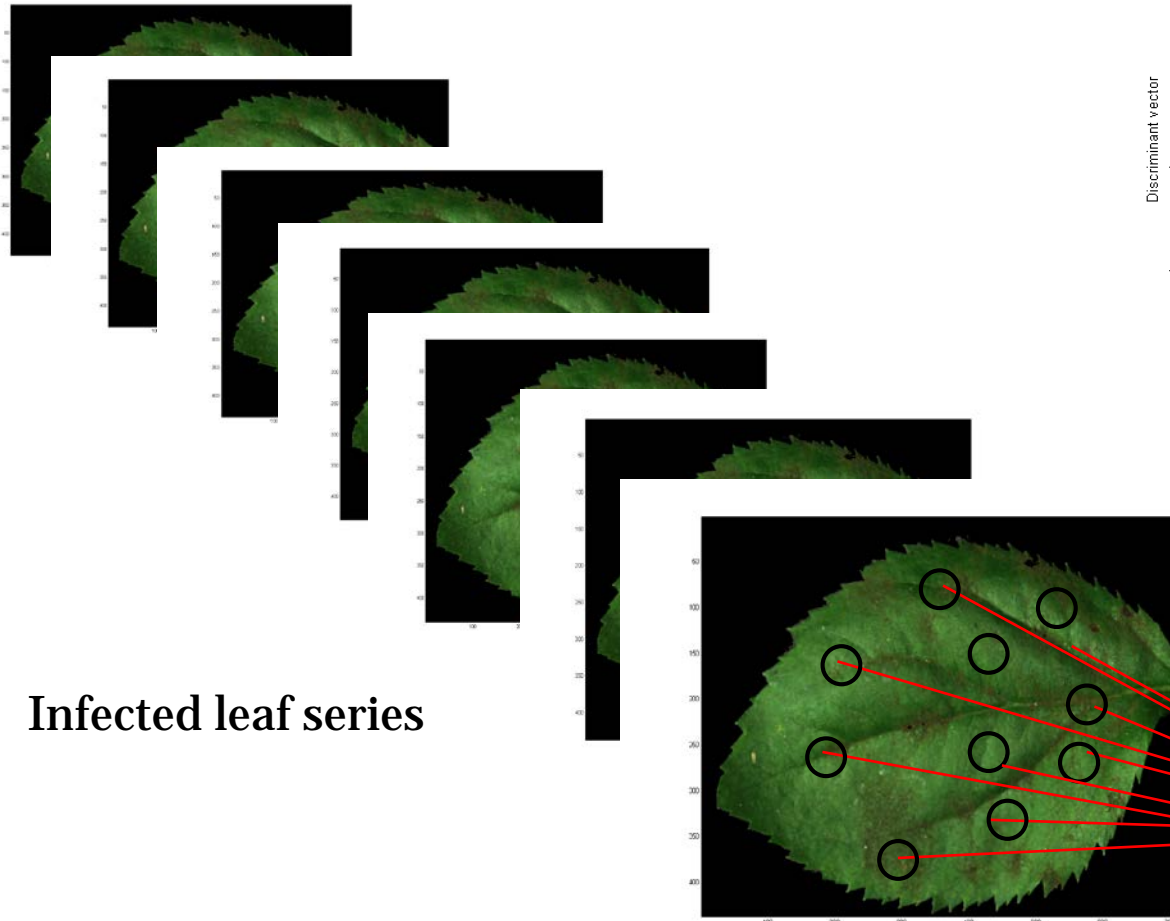
[Maroua.nouri@irstea.fr](mailto:Maroua.nouri@irstea.fr)

[Nouri@ctifl.fr](mailto:Nouri@ctifl.fr)

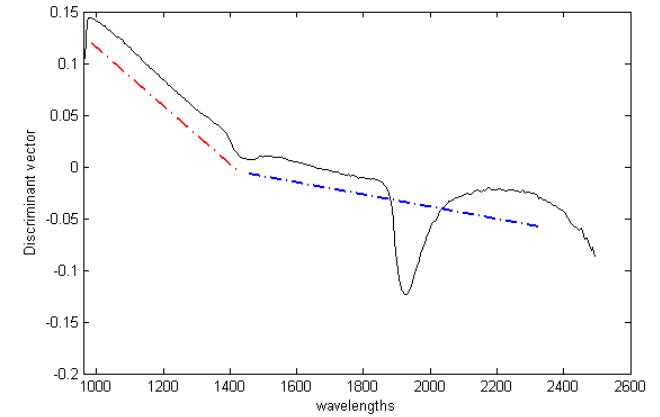


**Spectral curve of healthy and infected classes**

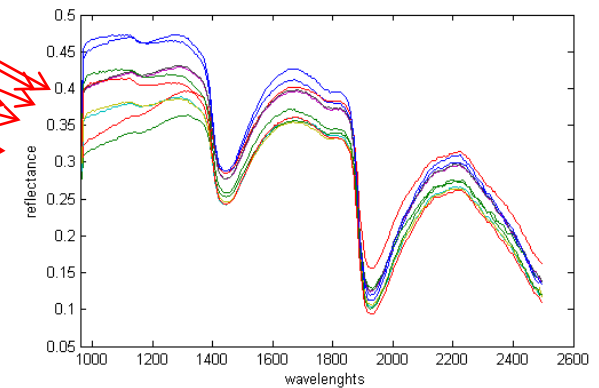
# Spectroscopy approach



Infected leaf series



PLSDA model





# Spectroscopy approach

	Percentage of predicted infected spots (%)
D11	50
D10	40
D09	20
D06	0
D05	0
D04	0
D03	0
D02	0