

Progress and achievements on the early detection of *Xylella fastidiosa* infection and symptom development with hyperspectral and thermal remote sensing imagery

Zarco-Tejada, P.J., Poblete, T., Calderon, R., Hornero, A., Hernández-Clemente, R., Kattenborn, T., Montes-Borrego, M., Román-Écija, M., Velasco-Amo, M.P., Susca, L., Morelli, M., Gonzalez-Dugo, V., Landa, B.B., Beck, P.S.A., Boscia, D., Saponari, M., Navas-Cortes, J.A.

Objectives

1. To assess hyperspectral and thermal imaging methods for the early detection of Xf -induced symptoms

The *role* of Remote Sensing in *Xf* detection

Asymptomatic

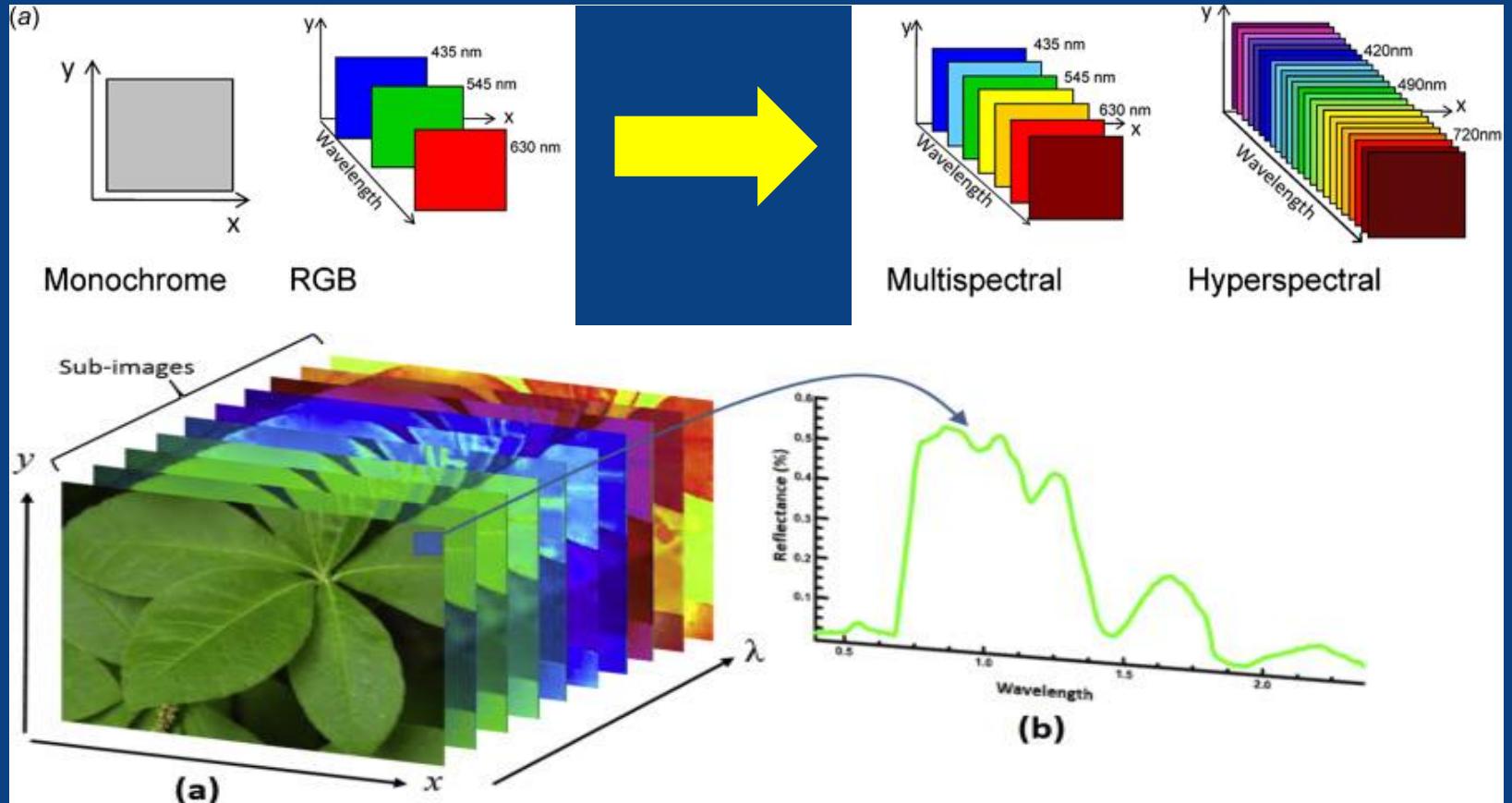
Initial

Severe

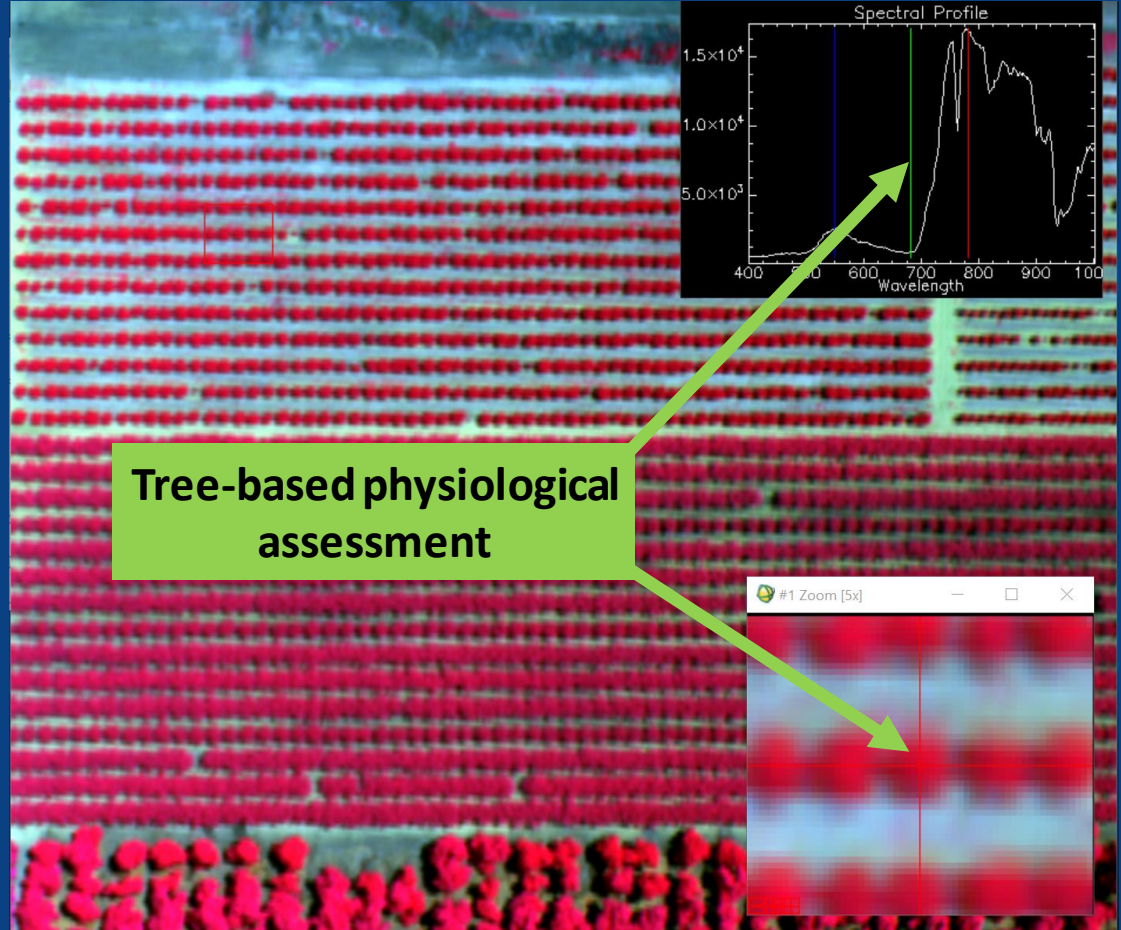
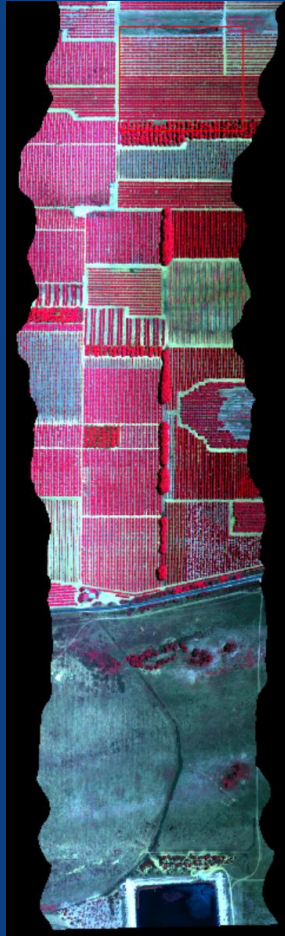


Physiological changes

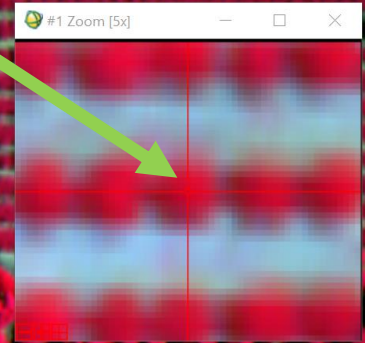
Imaging Spectroscopy



Hyperspectral flightline



Tree-based physiological assessment



The *role* of Remote Sensing in *Xf* detection

Asymptomatic

Initial

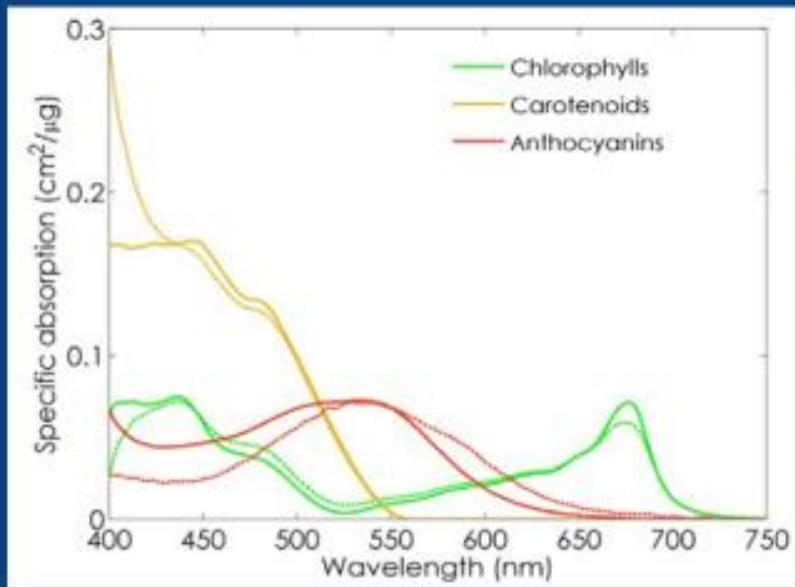
Severe



Structural changes

The *role* of Remote Sensing in *Xf* detection: pigments

Asymptoma



Chlorophyll *a+b* / Carotenoids
Anthocyanins / Xanthophylls

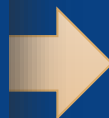
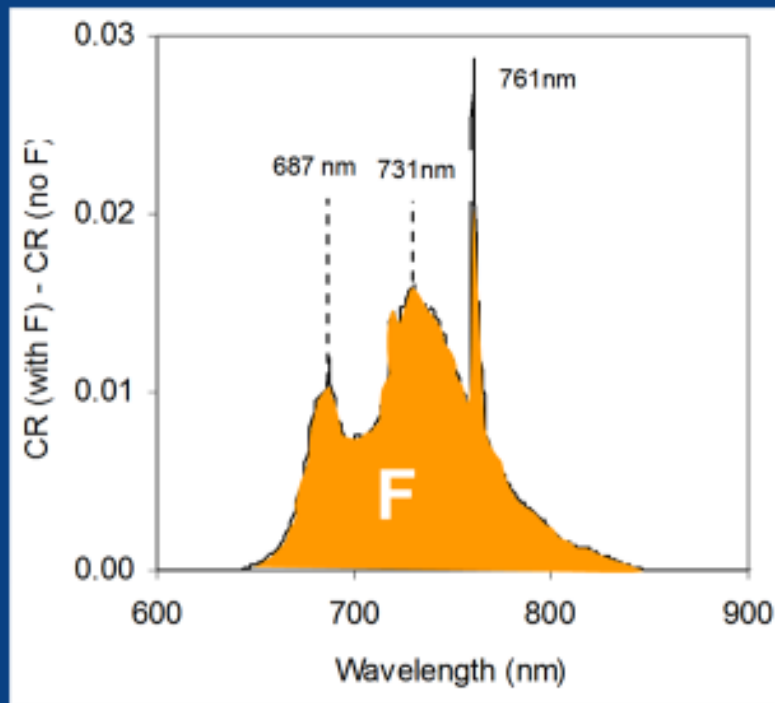
Indicators of
biotic stress



Asymptomatic

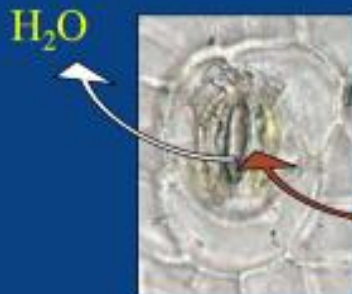
Solar-induced Chlorophyll Fluorescence quantification

- ~2% of the total incoming radiation
- Linked to photosynthesis
- High spectral resolution required
- Early indicator of stress



The *role* of Remote Sensing in *Xf* detection: transpiration

Asymptom



re



Transpiration

The *role* of Remote Sensing in *Xf* detection

Asymptomatic

Initial

Severe



Structural changes

Photosynthetic pigments

Fluorescence emission

Transpiration

The *role* of Remote Sensing in *Xf* detection

Asymptomatic

Initial

Severe



Structural changes

Photosynthetic pigments

Fluorescence emission

Transpiration

The *role* of Remote Sensing in *Xf* detection

Asymptomatic

Initial

Severe

DS 0

DS 1

DS 2

DS 3

DS 4

Damage mapping

Structural changes

Photosynthetic pigments

Fluorescence emission

Transpiration

The *role* of Remote Sensing in *Xf* detection

Asymptomatic

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Severe



Early detection

Structural changes

Photosynthetic pigments

Fluorescence emission

Transpiration

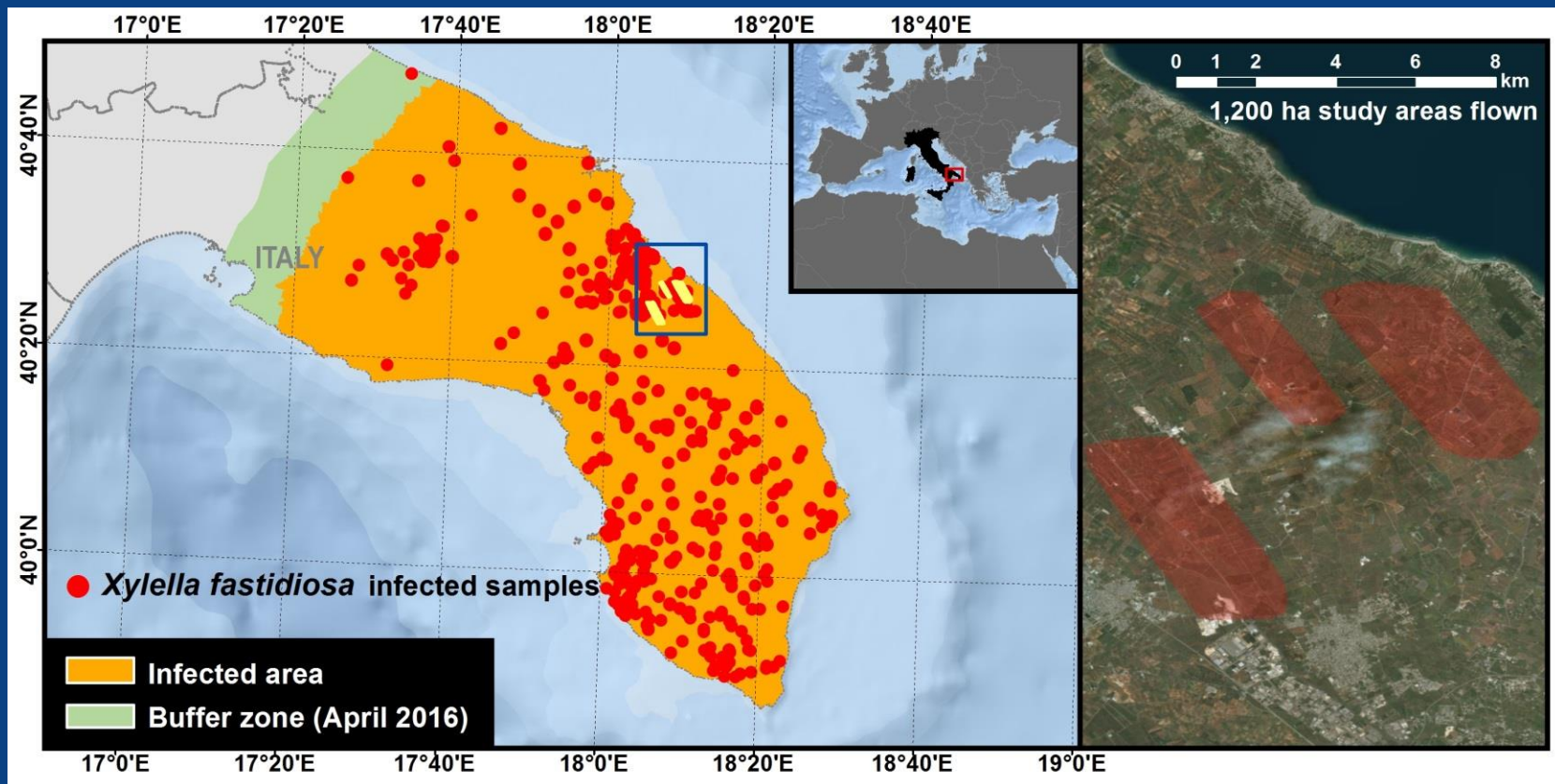
Spain



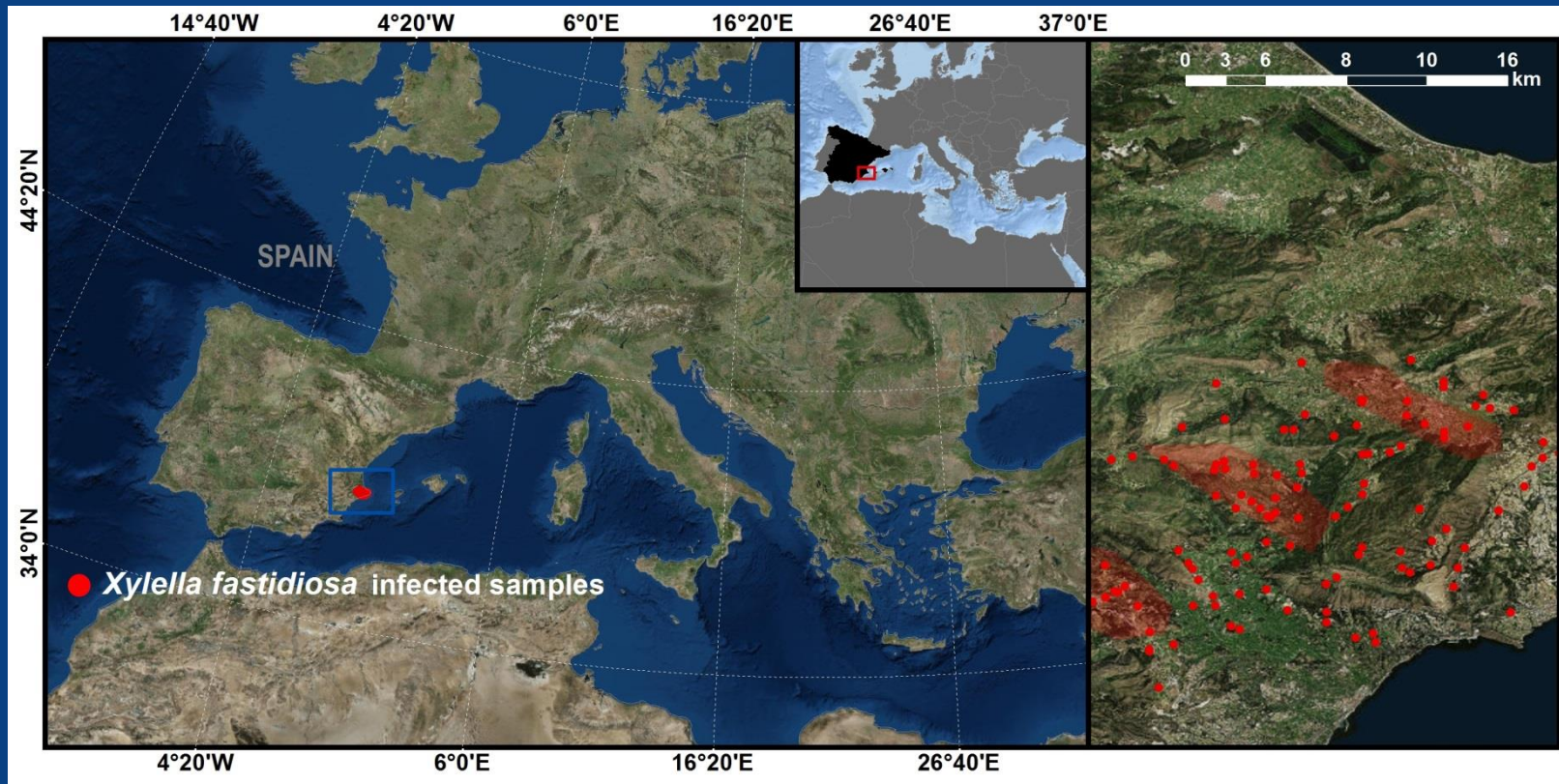
Italy



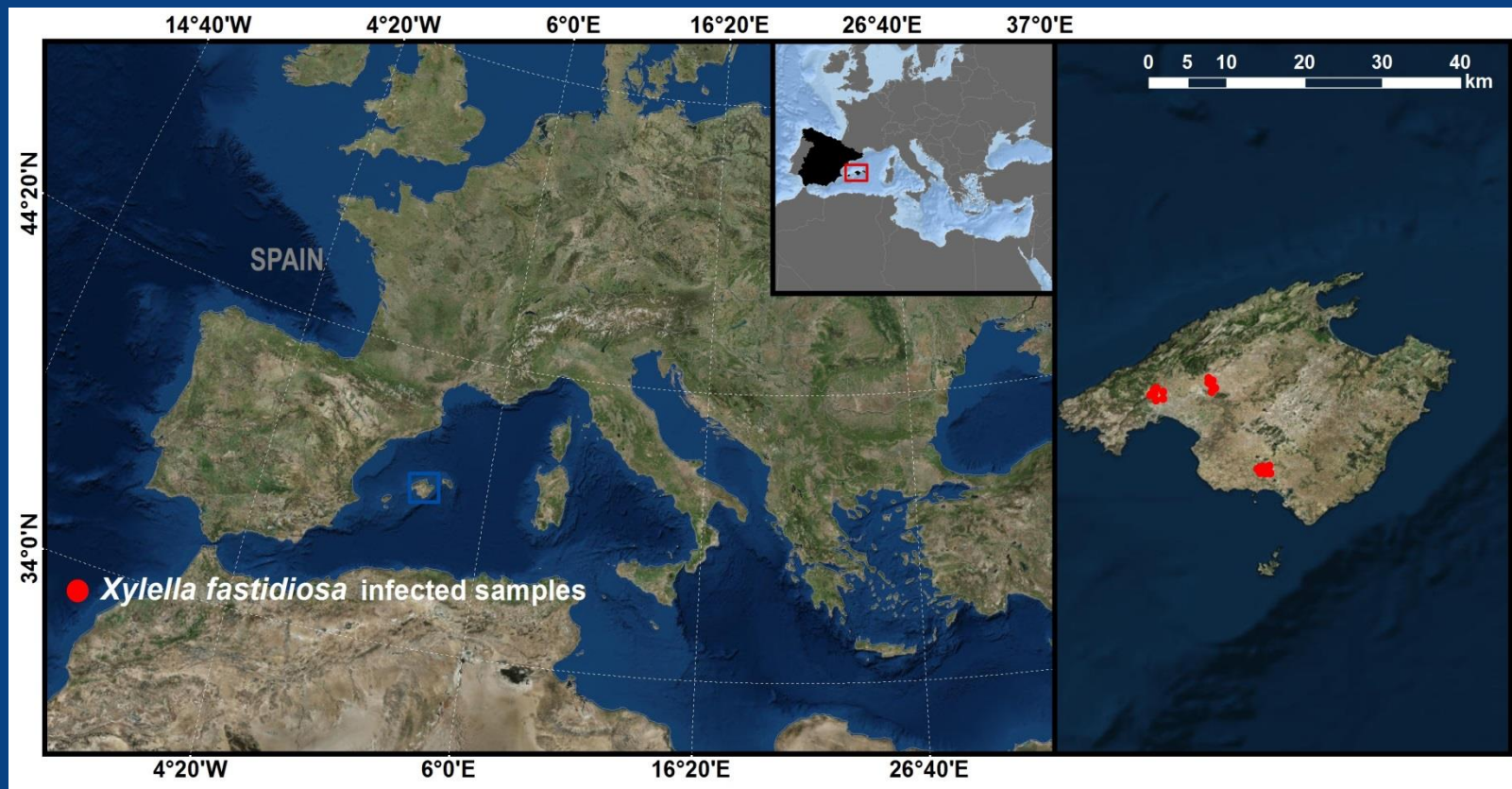
Airborne campaigns in the Puglia region, Italy



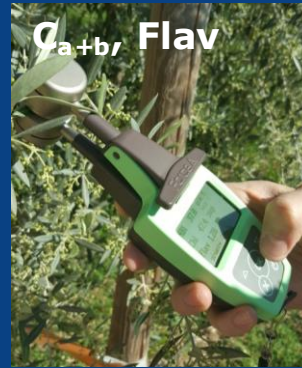
Airborne campaign in Alicante region, mainland Spain



Airborne campaigns in the Balearic Islands, Spain

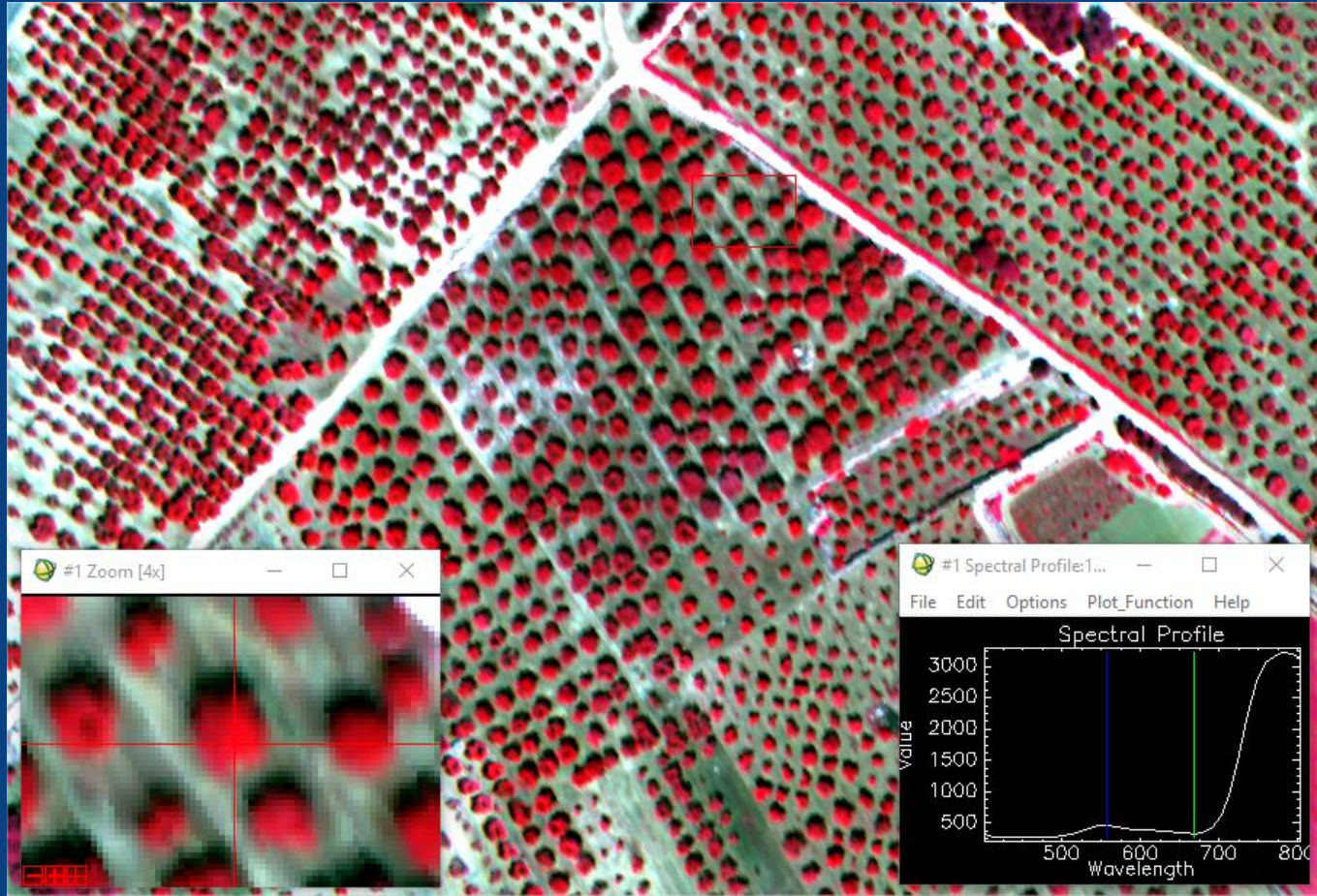


Field surveys

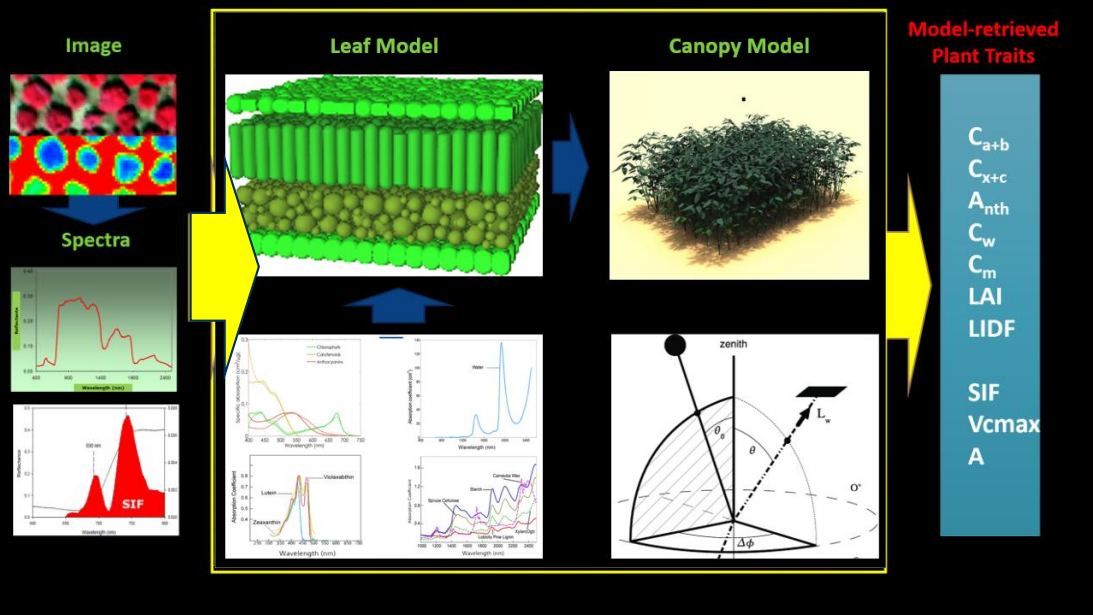


+ qPCR

High resolution Hyperspectral imagery



Linked leaf-canopy simulation models

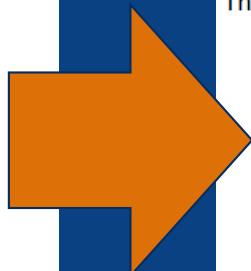
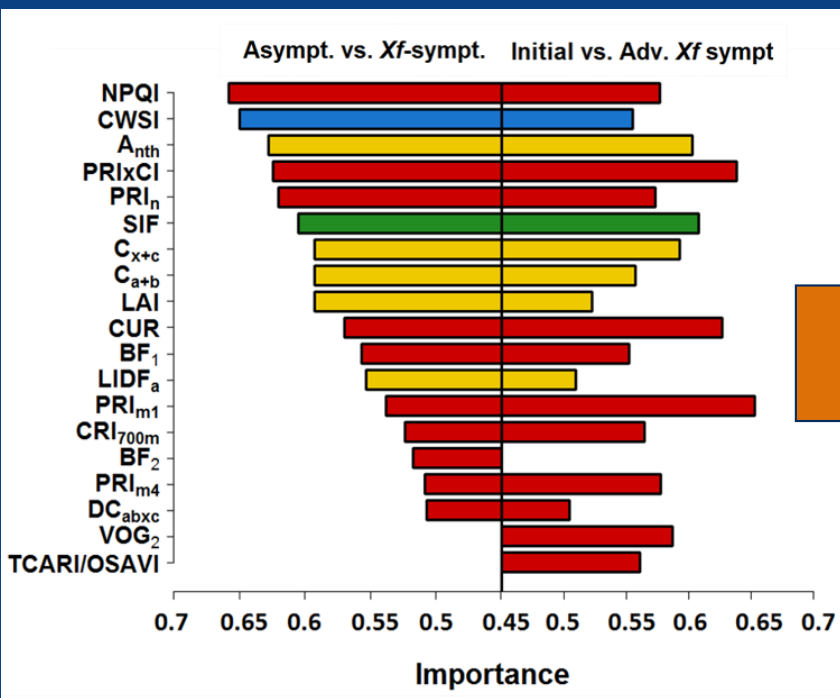


Machine
learning

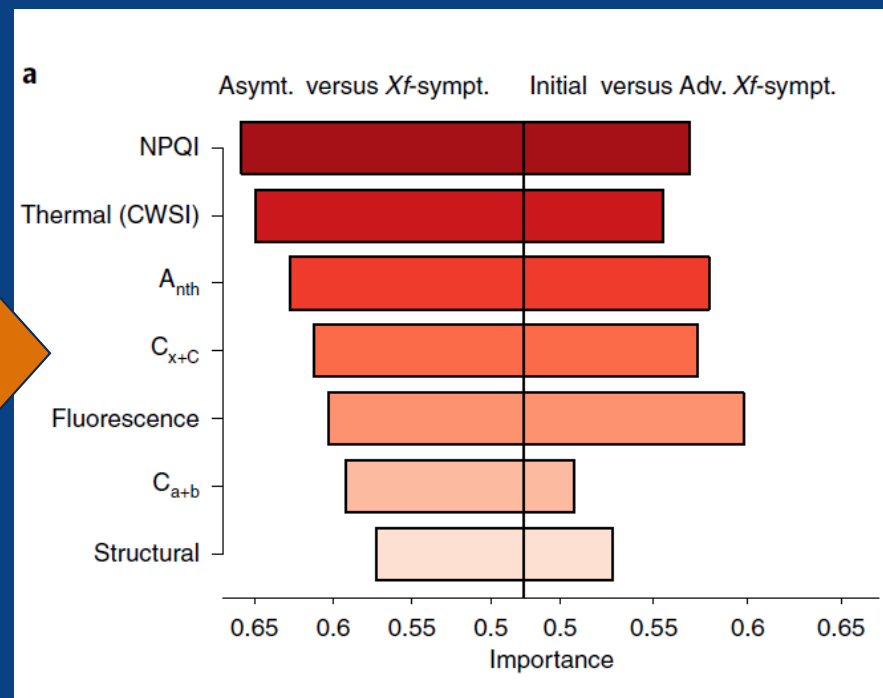


Sensitivity of Plant Traits to *Xf* symptoms - olive

Spectral plant traits



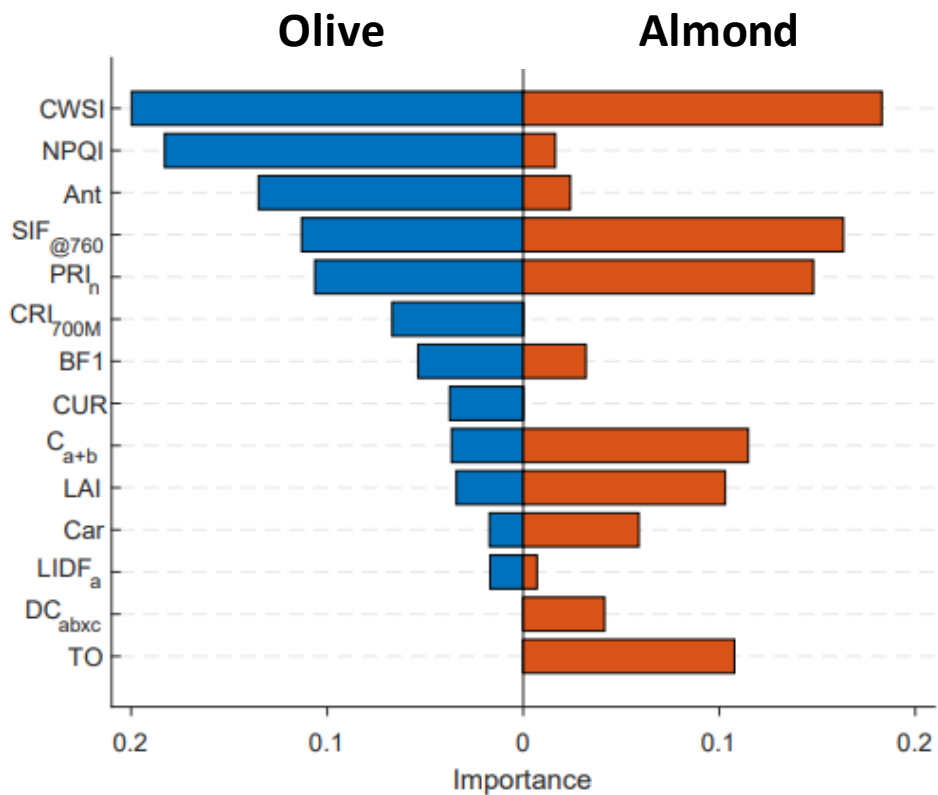
Spectral functional groups



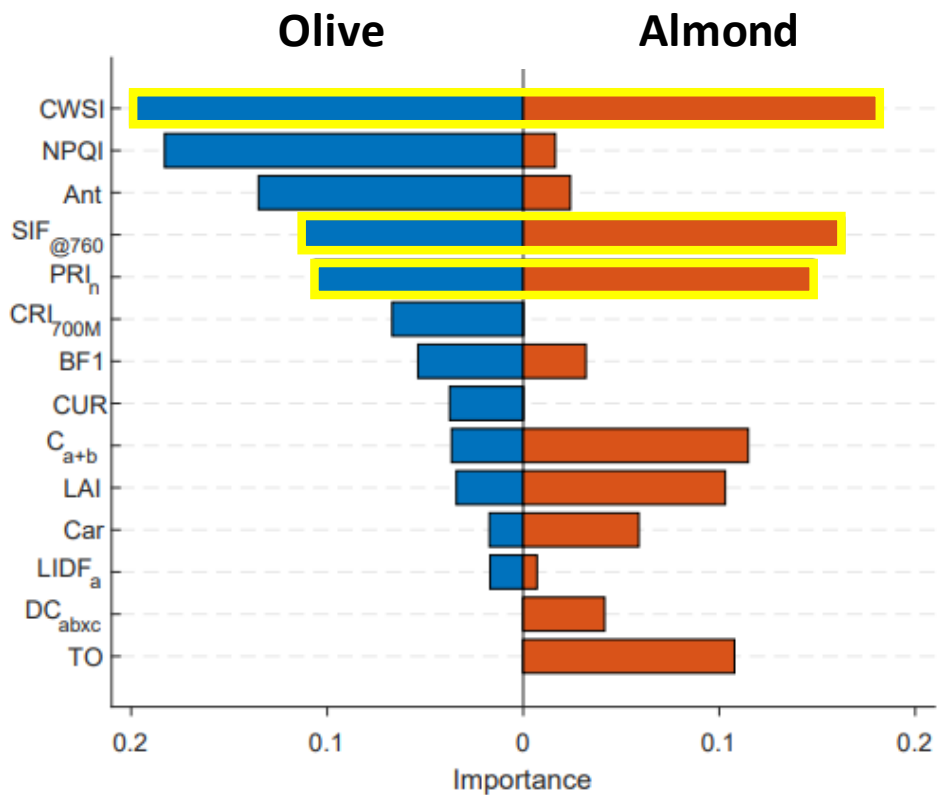
Objectives

1. To assess hyperspectral and thermal imaging methods for the early detection of *Xf*-induced symptoms
2. To evaluate spectral plant traits sensitive to *Xf* across species (olive / almond)
3. To quantify the influence of the abiotic condition on the detection of *Xf*

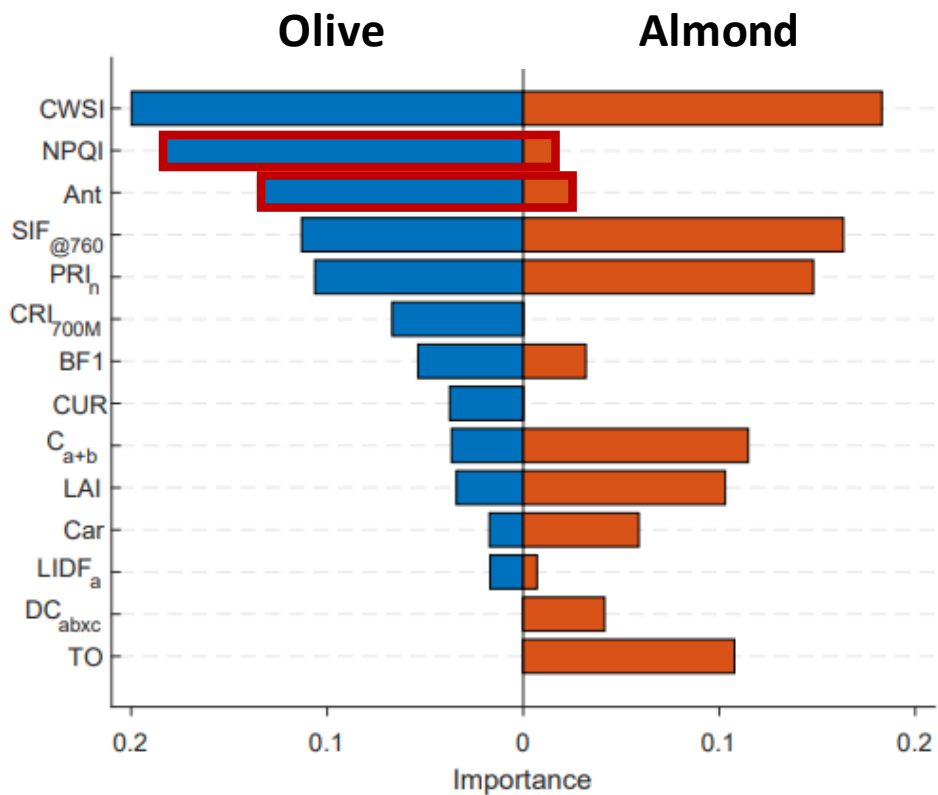
Importance of *Xf*-sensitive spectral traits in olive vs. almond



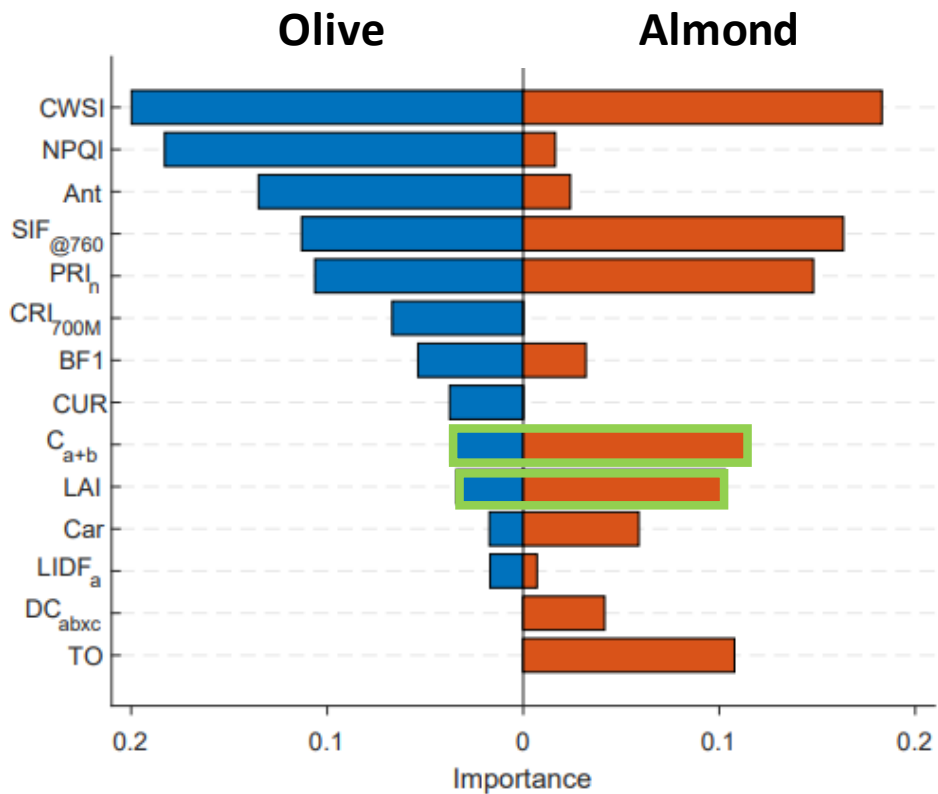
Importance of *Xf*-sensitive spectral traits in olive vs. almond



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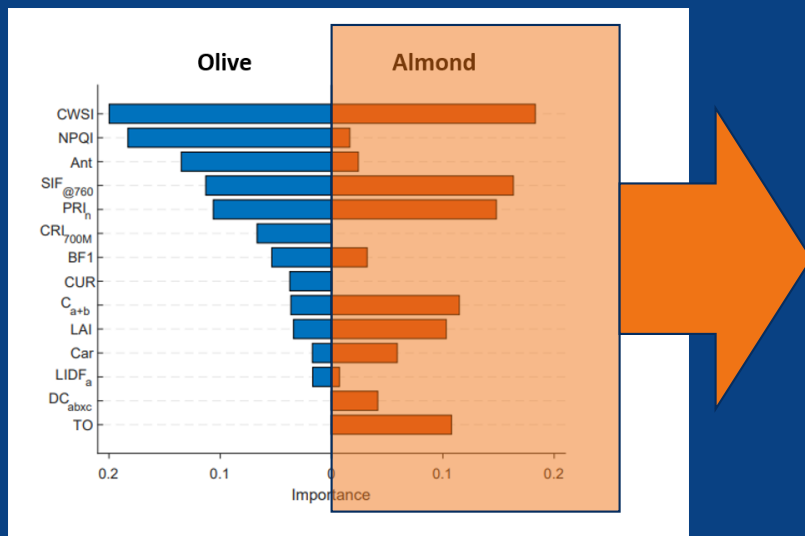


Importance of *Xf*-sensitive spectral traits in olive vs. almond

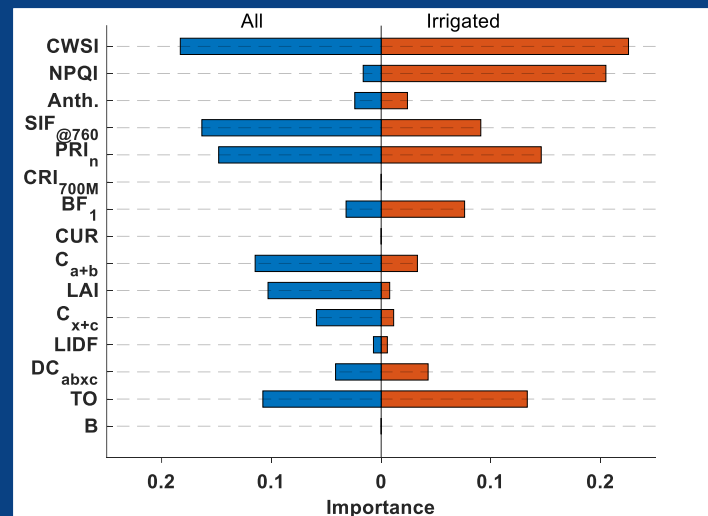


Water status effects on the spectral plant traits

Olive vs Almond

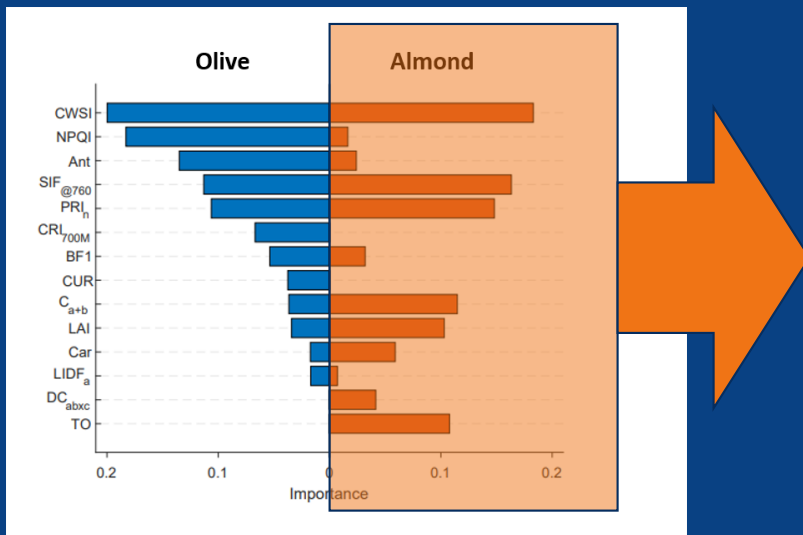


All vs. irrigated

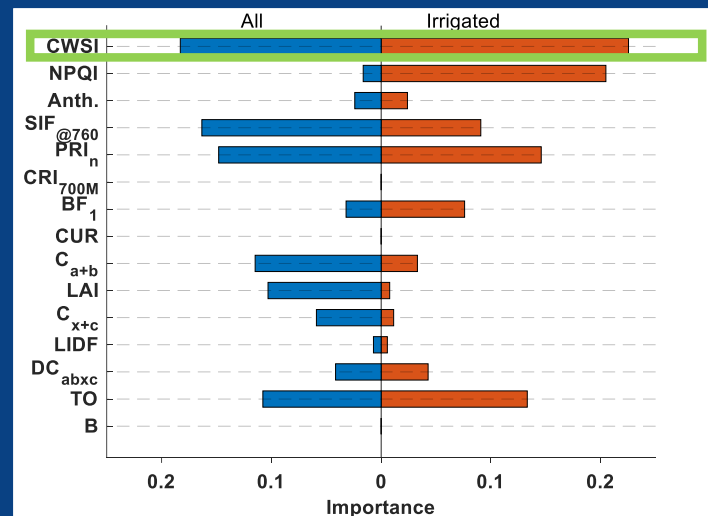


Water status effects on the spectral plant traits

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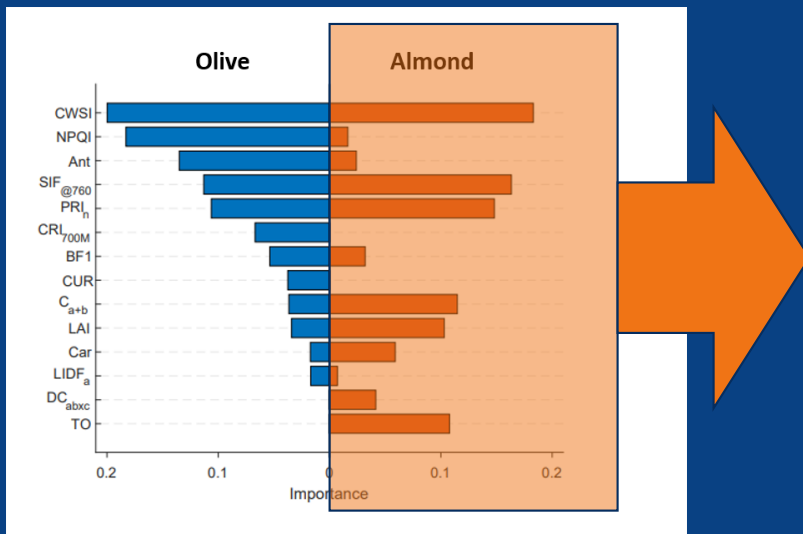


All vs. irrigated

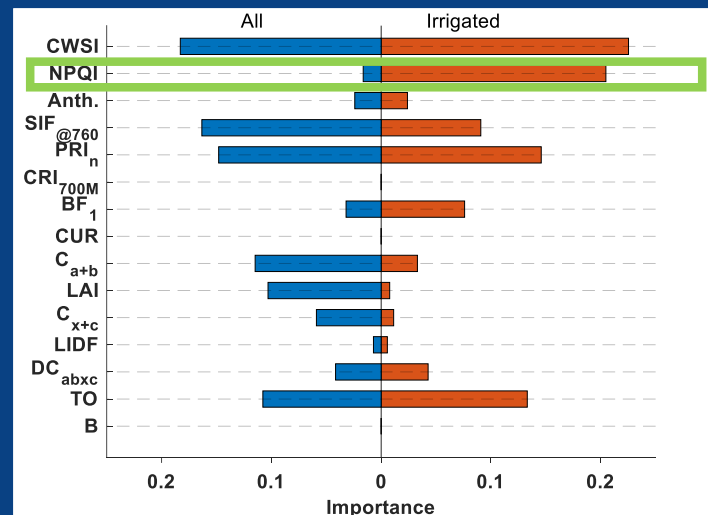


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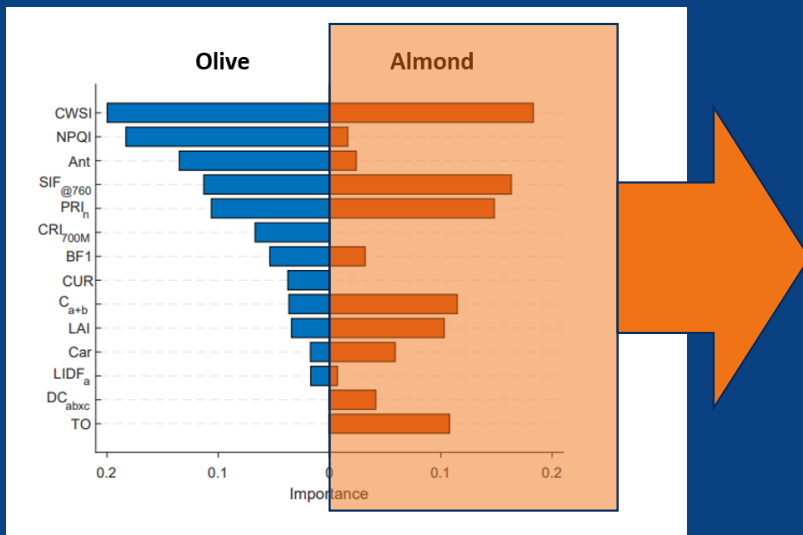


All vs. irrigated

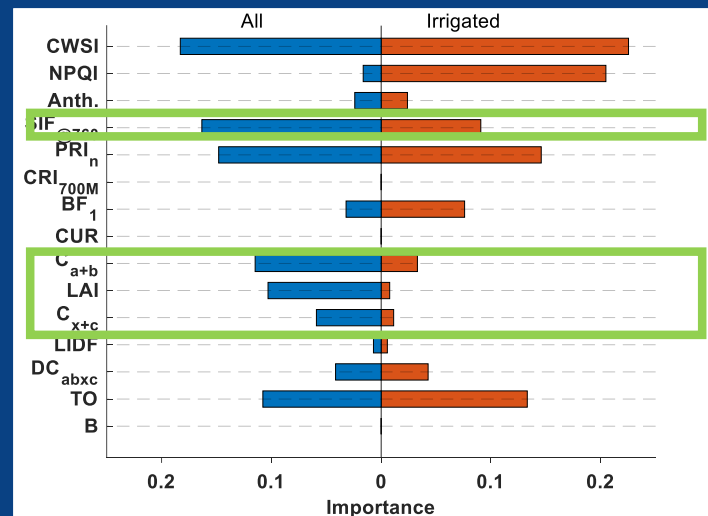


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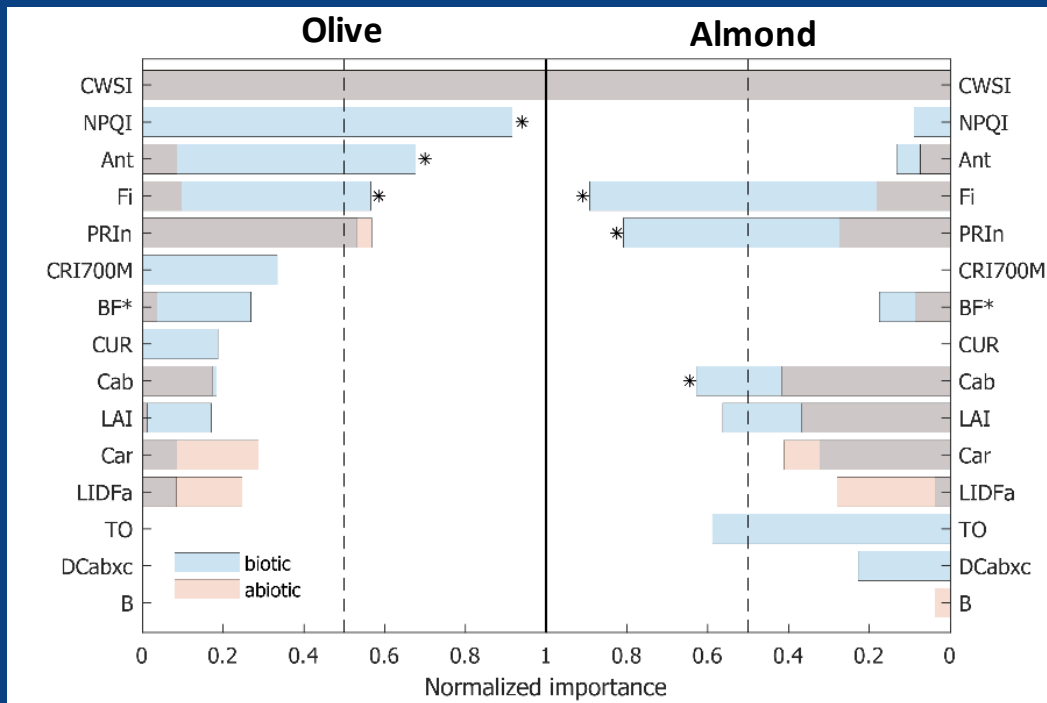
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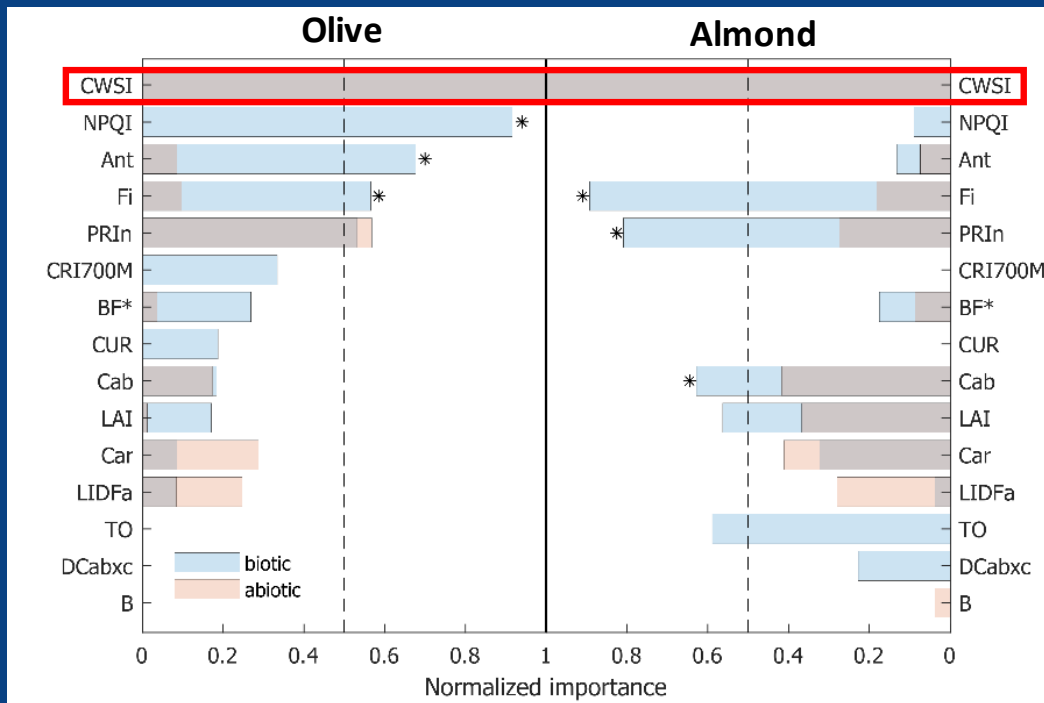


Xf – abiotic plant trait interactions for olive vs almond



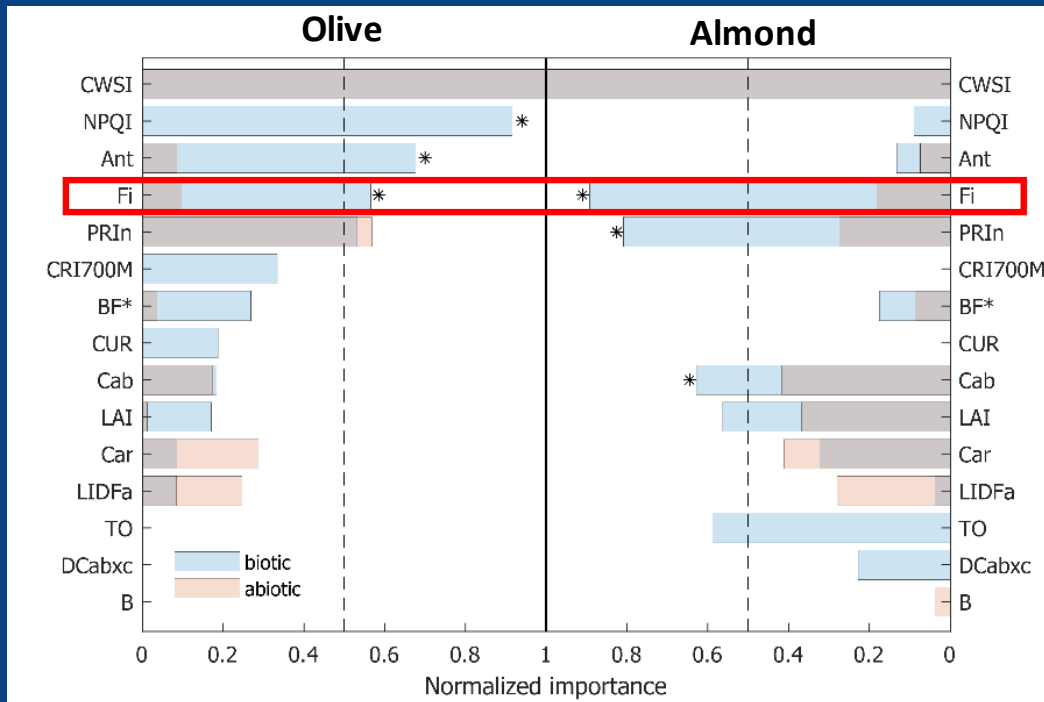
- CWSI common indicator of *Xf* and water stress
- Fluorescence emission important for *Xf* across olive and almond
- NPQI and anthocyanins are olive specific
- $PRIn$ and C_{a+b} are almond specific

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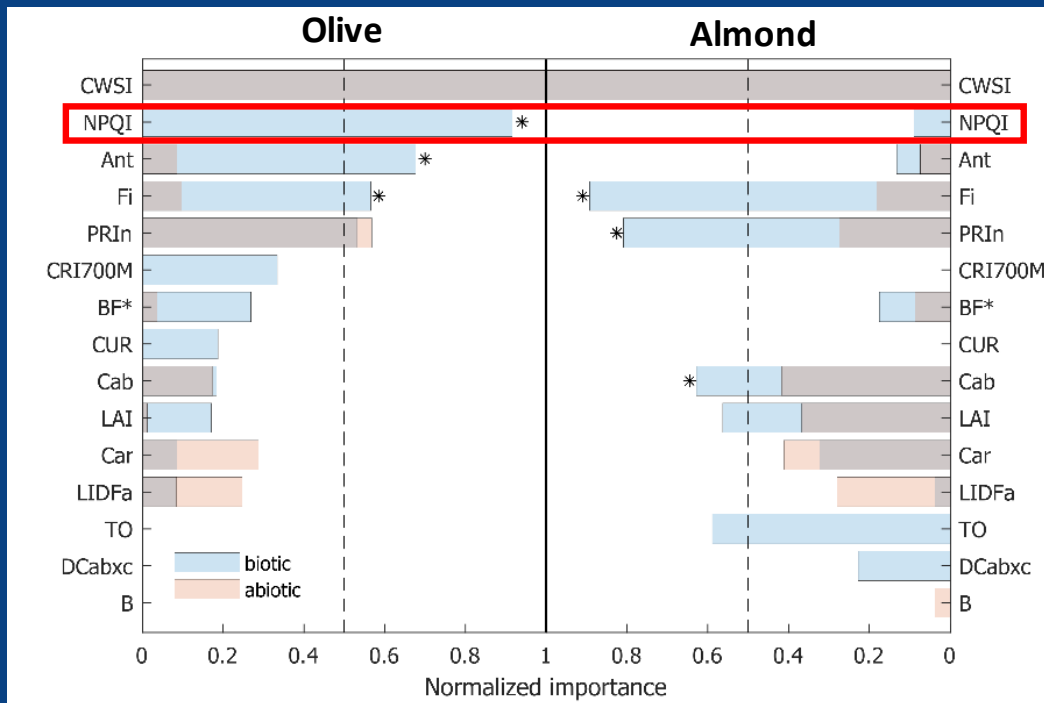
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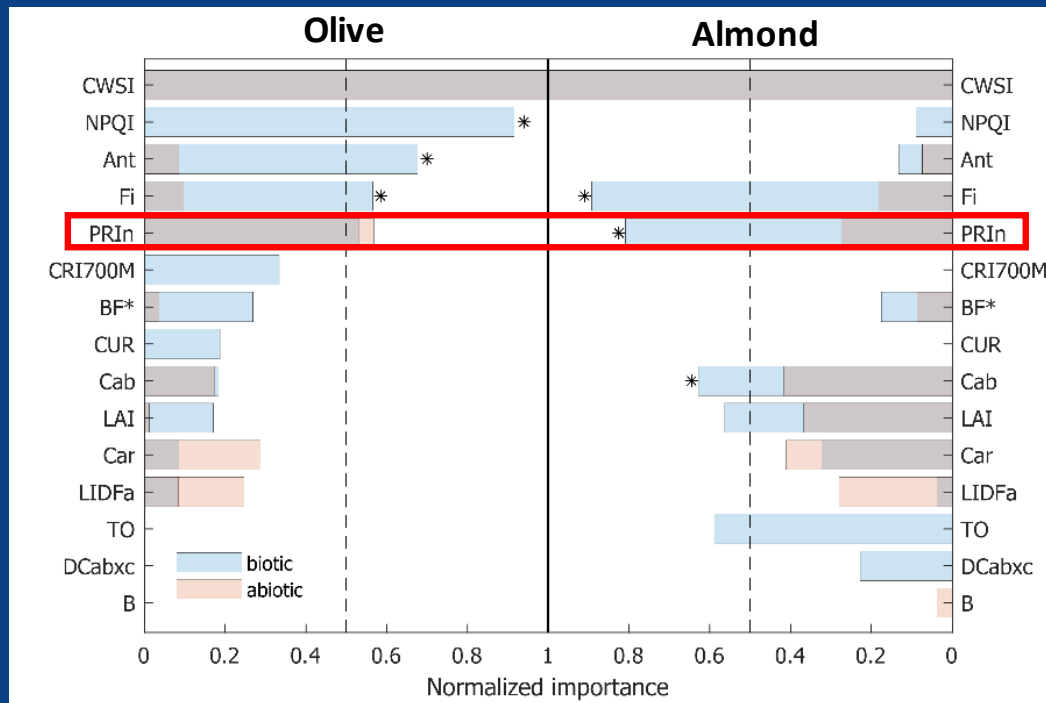
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Conclusions

1. Progress made on assessing hyperspectral and thermal remote sensing for *Xf* detection across olive and almond species ($OA > 0.8-0.9$; $k > 0.6$)
2. Specific spectral plant traits have been identified to successfully detect *Xf*-induced symptoms in olive and almond species (CWSI, NPQI, Anth, SIF and PRI_n)
3. Quantifying the water status (i.e. abiotic-induced stress level) is critical for improved *Xf* detection in almond and olive:
 - Almond: OA: 83% ($\kappa=0.65$) \rightarrow 94% ($\kappa=0.87$)
 - Olive: OA: 77% ($\kappa=0.43$) \rightarrow 92% ($\kappa=0.83$)
4. Airborne / drone hyperspectral and thermal imagery can be used for orchard scale *Xf* detection and monitoring (Poblete *et al.*, 2020; Camino *et al.*, 2021)
5. Satellite monitoring of *Xf* can be used for damage mapping, i.e. advanced severity levels (Hornero *et al.*, 2020)



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