

Non-Invasive Assessment, Classification, and Prediction of Biophysical Parameters Using Reflectance Hyperspectroscopy

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Table S1. Vegetation indices parameters applied for *Nicotiana tabacum* L. leaves of plants grown in high irradiance (full light) and low light (8.5% of full light) environments and submitted to a distinct gibberellin regime.

Index	Equation	Reference
NDVI ₆₈₀ = Normalized Difference Vegetation Index q680	$(R_{800}-R_{680})/(R_{800}+R_{680})$	[71]
NDVI ₇₅₀ = Normalized Difference Vegetation Index q750	$(R_{750}-R_{705})/(R_{750}+R_{705})$	[71]
SR ₆₈₀ = Simple Ratio Index q680	(R_{800}/R_{680})	[71]
SR ₇₀₅ = Simple Ratio Index q705	$(R_{750})/(R_{705})$	[95]
mSR ₇₀₅ = Modified Normalized Simple Ratio q705	$(R_{750}-R_{445})/(R_{705}+R_{445})$	[96]
mNDVI ₇₅₀ = Modified Normalized Difference Vegetation Index q750	$(R_{750}-R_{705})/(R_{750}+R_{705}-2 \times R_{445})$	[97]
RARS = Ratio Analysis of Reflectance Spectra	$(R_{746})/(R_{513})$	[98]
Achl = Absorption of Chlorophyll Index	$(R_{550})/(R_{500})$	[99]
BNb = Index for Chlorophyll Content	$(R_{800})/(R_{550})$	[99]
PVR = Normalized Difference Photosynthetic	$(R_{550}-R_{650})/(R_{550}+R_{650})$	[97]
PSND = Pigment Specific Normalized Difference	$(R_{800}-R_{470})/(R_{800}+R_{470})$	[100]
PSSRa = Pigment Specific Simple Ratio Chl <i>a</i>	$(R_{800})/(R_{680})$	[98]
PSSRb = Pigment Specific Simple Ratio Chl <i>b</i>	$(R_{800})/(R_{635})$	[95]
PSSRc = Pigment-specific Simple Ratio	$(R_{800})/(R_{500})$	[95]
PSRI = Plant Senescence Reflectance Index	$(R_{680}-R_{500})/(R_{750})$	[97]
PSRI2 = Plant Senescence Reflectance Index 2	$(R_{672})/(R_{550}+R_{708})$	[97]
MSI = Moisture Stress Index	(R_{1650}/R_{830})	[99]
PRI = Photochemical Reflectance Index	$(R_{530}-R_{570})/(R_{530}+R_{570})$	[101]
FR = Fluorescence Ratio	$(R_{690})/(R_{740})$	[102]
WBI = Water Band Index	$(R_{900})/(R_{970})$	[103]
DSWI = Disease-Water Stress Index	$(R_{802}+R_{547})/(R_{1657}+R_{682})$	[97]
DSWI-5 = Disease-Water Stress Index 5	$(R_{800}-R_{550})/(R_{1660}+R_{680})$	[97]

CRI1 = Carotenoid Reflectance Index 1	$(1/R_{510}) - (1/R_{550})$	[98]
CRI2 = Carotenoid Reflectance Index 2	$(1/R_{510}) - (1/R_{700})$	[71]
ARI1 = Anthocyanin Reflectance Index	$(1/R_{550}) - (1/R_{700})$	[100]
ARI2 = Anthocyanin Reflectance Index 2	$R_{800} \times ((1/R_{550}) - (1/R_{700}))$	[71]
FRI = Flavonol Reflectance Index	$R_{800} \times ((1/R_{410}) - (1/R_{460}))$	[99]
VOG1 = Vogelmann Index 1	$(R_{740}) / (R_{720})$	[99]
VOG2 = Vogelmann Index 2	$(R_{734} - R_{747}) / (R_{715} + R_{726})$	[100]
SIPI = Structurally Insensitive Pigment Index	$(R_{800} - R_{445}) / (R_{800} - R_{680})$	[104]
CAI1 = Cellulose Absorption Index 1	$100 \times (0.5(R_{2030} + R_{2210}) - R_{2100})$	[74]
CAI2 = Cellulose Absorption Index 2	$0.5 \times (R_{2020} + R_{2220}) - R_{2100}$	[74]
NDLI = Normalized Difference Lignin Index	$[\log(1/R_{1754}) - \log(1/R_{1680})] / [\log(1/R_{1754}) + \log(1/R_{1680})]$	[78]
NDNI = Normalized Difference Nitrogen Index	$[\log(1/R_{1510}) - \log(1/R_{1680})] / [\log(1/R_{1510}) + \log(1/R_{1680})]$	[78]

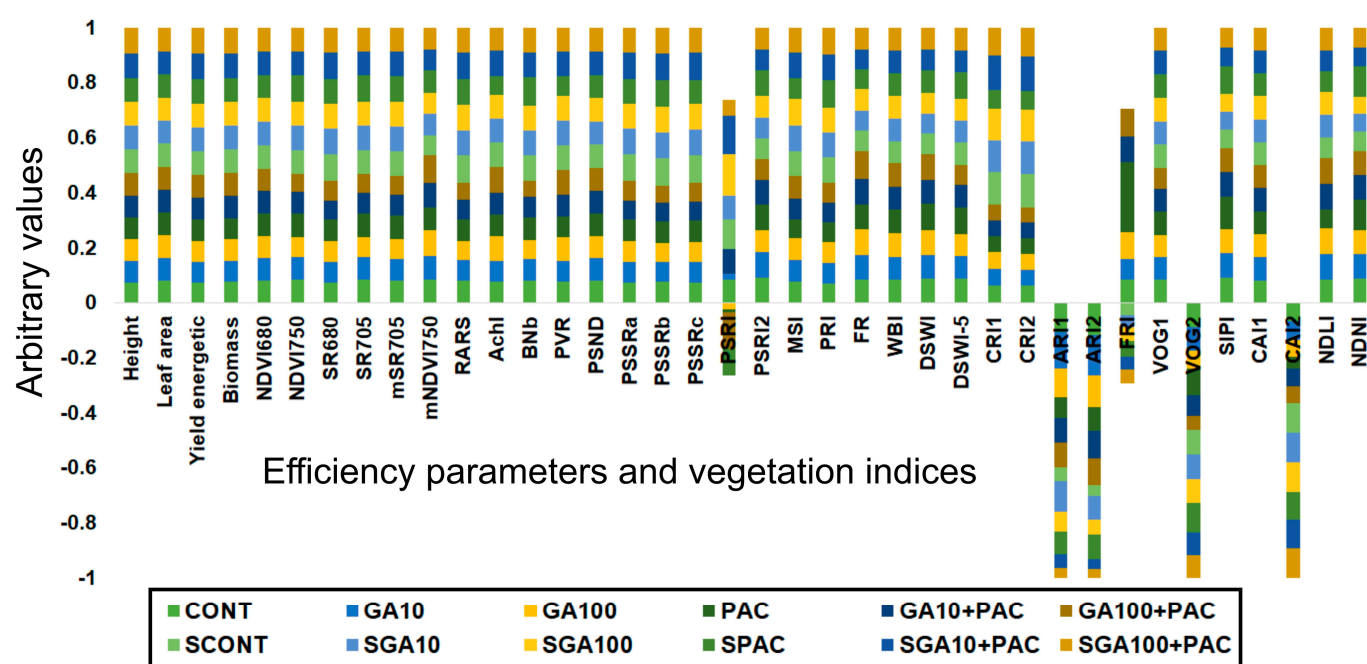


Figure S1. Vegetation index parameters calculated for arbitrary values (%) on *Nicotiana tabacum* L. leaves of plants grown in high irradiance (full light) and low-light (8.5% of full light) environments and submitted to distinct gibberellin regimes. For abbreviations, see Figure 1 and Table S1.

References

- Gitelson, A.; Merzlyak, M.N. Spectral Reflectance Changes Associated with Autumn Senescence of *Aesculus hippocastanum* L. and *Acer platanoides* L. Leaves. Spectral Features and Relation to Chlorophyll Estimation. *J. Plant Physiol.* **1994**, *143*, 286–292.
- Nagler, P.L.; Inoue, Y.; Glenn, E.P.; Russ, A.L.; Daughtry, C.S.T. Cellulose Absorption Index (CAI) to Quantify Mixed Soil–Plant Litter Scenes. *Remote Sens. Environ.* **2003**, *87*, 310–325.
- Serrano, L.; Peñuelas, J.; Ustin, S.L. Remote Sensing of Nitrogen and Lignin in Mediterranean Vegetation from AVIRIS Data: Decomposing Biochemical from Structural Signals. *Remote Sens. Environ.* **2002**, *81*, 355–364.

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95. Lang, M.; Stober, F.; Lichtenthaler, H.K. Fluorescence Emission Spectra of Plant Leaves and Plant Constituents. *Radiat. Environ. Biophys.* **1991**, *30*, 333–347.
 96. Stimson, H.C.; Breshears, D.D.; Ustin, S.L.; Kefauver, S.C. Spectral Sensing of Foliar Water Conditions in Two Co-Occurring Conifer Species: *Pinus edulis* and *Juniperus monosperma*. *Remote Sens. Environ.* **2005**, *96*, 108–118.
 97. Apan, A.; Held, A.; Phinn, S.; Markley, J. Formulation and Assessment of Narrow-Band Vegetation Indices from EO-1 Hyperion Imagery for Discriminating Sugarcane Disease. In Proceedings of the 2003 Spatial Sciences Institute Biennial Conference: Spatial Knowledge Without Boundaries (SSC2003), Canberra, Australia, 22–27 September 2003; pp. 1–13.
 98. Chappelle, E.W.; Kim, M.S.; McMurtrey, J.E. Ratio Analysis of Reflectance Spectra (RARS): An Algorithm for the Remote Estimation of the Concentrations of Chlorophyll A, Chlorophyll B, and Carotenoids in Soybean Leaves. *Remote Sens. Environ.* **1992**, *39*, 239–247.
 99. Pontius, J.; Martin, M.; Plourde, L.; Hallett, R. Ash Decline Assessment in Emerald Ash Borer-Infested Regions: A Test of Tree-Level, Hyperspectral Technologies. *Remote Sens. Environ.* **2008**, *112*, 2665–2676.
 100. Metternicht, G. Vegetation Indices Derived from High-Resolution Airborne Videography for Precision Crop Management. *Int. J. Remote Sens.* **2003**, *24*, 2855–2877.
 101. Blackburn, G.A. Spectral Indices for Estimating Photosynthetic Pigment Concentrations: A Test Using Senescent Tree Leaves. *Int. J. Remote Sens.* **1998**, *19*, 657–675.
 102. Merzlyak, M.N.; Chivkunova, O.B.; Solovchenko, A.E.; Naqvi, K.R. Light Absorption by Anthocyanins in Juvenile, Stressed, and Senescing Leaves. *J. Exp. Bot.* **2008**, *59*, 3903–3911.
 103. Gitelson, A. Nondestructive Estimation of Foliar Pigments (Chlorophylls, Carotenoids, and Anthocyanins) Contents: Evaluating a Semianalytical Three-Band Model. In *Hyperspectral Remote Sensing of Vegetation*; Thenkaail, P.S., Lyon, J.G., Huete, A., Eds.; CRC Press: New York, NY, USA, 2011; p. 782.
 104. Garbulsky, M.F.; Peñuelas, J.; Gamon, J.; Inoue, Y.; Filella, I. The Photochemical Reflectance Index (PRI) and the Remote Sensing of Leaf, Canopy and Ecosystem Radiation Use Efficiencies. A Review and Meta-Analysis. *Remote Sens. Environ.* **2011**, *115*, 281–297.