Chapter 6 Sensing of Photosynthetic Activity of Crops

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Abstract The light use efficiency of photosynthesis dynamically adapts to environmental factors and is one major factor determining crop yield. Optical remote sensing techniques have the potential to detect physiological and biochemical changes in plant ecosystems, and non-invasive detection of changes in photosynthetic energy conversion may be of great potential for managing agricultural production in a future bio-based economy. Here we give an overview on the principles of optical remote sensing in crop systems with a special emphasis on investigating hyperspectral reflectance data and the sun-induced fluorescence signal. Especially sun-induced fluorescence as a parameter, which becomes important in remote sensing research may have great potential quantifying the physiological status of the photosynthetic apparatus. Both remote sensing principles were applied during the CEFLES2 campaign in Southern France, where the structural and functional status of several crops was measured on the ground and using state-of-the-art optical remote sensing techniques. Sun-induced fluorescence measurements over a variety of crops showed that additional information can be retrieved also over dense canopies, where classical remote sensing signals often saturate. With a view to the future, we discuss how hyperspectral reflectance and sun-induced fluorescence can quantitatively be related to photosynthetic efficiency and help to measure and manage productivity of natural and agricultural ecosystems.

1 Background on Optical Spectroscopy of Plant Canopies

Solar radiation that interacts with plant tissues or plant canopies is either reflected, absorbed or transmitted (Fig. [6.1,](#page-1-0) left). The spectral characteristics of the three components at leaf or canopy scale are a function of (I) leaf level absorption and scattering, (II) the optical properties of other canopy components and the canopy

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Fig. 6.1 *Left*: Conceptual scheme of light absorption, transmission and reflection in plant tissues. *Right*: Spectral characteristics of absorption, reflection, and transmission illustrated at a winter wheat leaf (*Tritium aestivum* L.)

architecture itself, and (III) external effects (illumination, observation geometry) (Goel [1988,](#page-11-0) [1989,](#page-11-1) Chen et al. [2000\)](#page-10-0). Optical spectroscopy mainly focuses on the reflected part of radiation as a measure to derive information about the biochemical and structural properties of plants at leaf and canopy level (Fourty and Baret [1998,](#page-10-1) Liang [2004\)](#page-11-2), whereas the optical properties of leaf tissues significantly determine the canopy optical parameters (Asner [1998,](#page-10-2) Otterman et al. [1995\)](#page-11-3). For instance, the low intensity reflectance of plant leaves in the visible (400–700 nm) part of the light spectrum results from strong absorbance by the photosynthetic foliar pigments, while the high reflectance in the near infrared (700–1,100 nm) is due to low absorption of light by the internal leaf mesophyll tissues, and the reflectance intensity in the shortwave infrared (1,100–2,500 nm) is strongly affected by the amount of water in plant tissues (Curran [1989\)](#page-10-3) (Fig. [6.1,](#page-1-0) right).

During the phenological cycle, in response to an adaption of plants to environmental conditions, or between different species, leaf biochemical components vary and cause variations in the interaction of solar radiation with leaf tissues (Gausman and Allen [1973,](#page-10-4) Grant [1987\)](#page-11-4). This, in turn, results in changing optical properties of leaf tissues. Figure [6.2](#page-1-1) exemplarily shows the variation of reflected radiation in response to varying chlorophyll and water content.

Fig. 6.2 Leaf reflection in response to the varying leaf biochemical components chlorophyll (*left*) and water content (*right*). Simulations were performed using the leaf reflectance model PROSPECT (Jaquemoud and Baret 1990)

2 Remote Sensing of Photosynthesis

Sensing the state of photosynthetic activity, however, is much more complex and the sole information about pigment content is insufficient to predict the current photosynthetic rate. In fact, plant photosynthesis is a dynamically regulated process that quickly adapts to environmental conditions and is affected by the ecological plasticity of each species (Turner et al. [2003b,](#page-12-0) Rascher and Nedbal [2006\)](#page-12-1). Consequently, photosynthetic rates may greatly vary between different species with similar pigment composition and, additionally, both photosynthesis and pigment composition is dynamically adjusted in diurnal and seasonal cycles (Schurr et al. [2006\)](#page-12-2). Most of the time, natural canopy photosynthesis is not operating at its maximum potential rate and may be largely reduced under prevailing environmental conditions. For example, Bergh et al. (1998) estimated that the CO₂ uptake by a frost stressed boreal forest over a growing season reached only 44% from its potential rate or, Rascher et al. [\(2004\)](#page-12-3) observed a 30% decrease in photosynthesis as response of drought stress in a tropical ecosystem. These reductions of photosynthetic rates cannot be tracked by the pigment content and the pigment composition itself.

The remote observation of photosynthetic rates can principally be grouped into two approaches: methods that indirectly relate photosynthesis to environmental stresses and approaches that estimate photosynthesis directly from remote sensing data. Recent research effort has focused on estimating the physiological status of photosynthesis directly from remotely sensed data because remote sensing provides the only practical approach to characterize photosynthesis and productivity of vast crop and natural ecosystems. The efficiency of photosynthesis is controlled on various levels involving biophysical and biochemical mechanisms (see Schulze and Caldwell [1995](#page-12-4) for a summary on the ecophysiology of photosynthesis). Light absorbed by chlorophyll can be used to (I) drive photosynthesis, and (II) excess energy can be dissipated by a variety of non-photochemical processes usually as heat or, (III) it can be reemitted as fluorescence at longer wavelengths. These three processes compete with each other and an increase in the efficiency of one will result in the decrease of yield in the other two. The major component of the Non-Photochemical Quenching (NPQ) is related to a transthylakoid pH gradient, which activates enzymes altering the epoxidation state of xanthophyll molecules associated with the light harvesting complex and this affects the energy dissipation as heat (Demmig-Adams and Adams [1996,](#page-10-6) Müller et al. [2001,](#page-11-5) Baker [2008\)](#page-10-7).

In the following two state-of-the-art remote sensing approaches (based on hyperspectral reflectance data and on the emitted sun-induced fluorescence signal) are described for the potential to directly measure the functional status of photosynthesis.

2.1 Photochemical Reflectance Index (PRI)

The Photochemical Reflectance Index (PRI) is related to NPQ and was developed to serve as an estimate of photosynthetic light use efficiency. This normalized difference reflectance index uses two wavebands (Eq. [1\)](#page-3-0): 531 nm, which is correlated with the xanthophyll pigment composition during the NPQ energy dissipation, and 570 nm, which serves as a reference waveband (Gamon et al. [1992\)](#page-10-8).

$$
PRI = \frac{R_{531} - R_{570}}{R_{531} + R_{570}}\tag{1}
$$

PRI has been used in a variety of case studies and positively correlates with photosynthetic efficiency. It has been successfully used to detect changes in photo-synthetic efficiency at the leaf level (see Rascher et al. [2007,](#page-12-5) for an overview of the literature).

However, PRI values vary greatly between species with the same photosynthetic capacity (Guo and Trotter [2004\)](#page-11-6). Additionally, the PRI is greatly affected by the geometry of the sun, the leaf, and the detector (Barton and North [2001\)](#page-10-9). As natural canopies are an assembly of differently oriented leaves that additionally change their orientation during development of the plant and as a response to environmental conditions, canopy measurements of PRI often were greatly affected by seasonal changes in canopy structure (Filella et al. [2004\)](#page-10-10). Thus, challenges remain to transfer the very promising results from the laboratory to the canopy and field scale. One of the first successful demonstrations of field measurements was performed in a Siberian forest (Nichol et al. [2002\)](#page-11-7). Since then several groups have further evaluated the potential of PRI and are currently identifying procedures to scale and use the PRI on natural canopies (Hall et al. [2008\)](#page-11-8).

2.2 Fluorescence

Light energy that is absorbed in photosynthetic pigments is partly re-emitted as fluorescence light with well defined wavelength characteristics. Chlorophyll fluorescence is emitted in two broad, overlapping bands with peaks at 685 nm and around 740 nm (Fig. [6.3a](#page-4-0); Lichtenthaler and Rinderle [1988\)](#page-11-9). However, the total amount of the emitted fluorescence signal is small in comparison the reflected light (Fig. [6.3b\)](#page-4-0). The intensity of the emitted fluorescence signal is reversely correlated to the energy used for photosynthesis and thus can serve as an indicator for photosynthetic light conversion (see Baker [2008](#page-10-7) for a recent review). Fluorescence approaches for analysis of photosynthesis have been developed over the past couple of decades. The most commonly used technique is the Pulse Amplitude Modulation (PAM) fluorometry, which uses the saturating light pulse method (Schreiber and Bilger [1993,](#page-12-6) Schreiber et al. [1995,](#page-12-7) Genty et al. [1989,](#page-11-10) Maxwell and Johnson [2000\)](#page-11-11). PAM data can be analyzed to determine the efficiency with which absorbed photons are being used for photosynthesis, the rates of electron transport, and the degree of non-photochemical protection. This approach requires measurements very close to the leaf as a saturating light pulse has to be applied and is therefore not practical for measurements of plant canopies. However, processes within canopy with millions of leaves – each in its unique environment and all contributing to the overall performance of the canopy – provide many challenges and cannot be derived from

Fig. 6.3 (**a**) Fluorescence and reflectance spectra of a sugar beet leaf. (**a**) Fluorescence emission spectrum in the region between 650 and 820 nm. (**b**) Reflectance with and without fluorescence, i.e. real and apparent reflectance. Measurements were performed on a sugar beet leaf under solar illumination with an ASD FieldSpec Pro coupled with the FluoWAT leaf clip (Alonso et al. [2007\)](#page-10-11), which enables the extraction of the fluorescence spectrum by selectively filtering the incoming light. For details see Meroni et al. [\(2009\)](#page-11-12)

single leaf measurements. Therefore, techniques and instruments for measurements on canopy scale are required and several approaches are currently being developed for application from a distance for the remote quantification of plant canopies and fields (Osmond et al. [2004,](#page-11-13) Rascher et al. [2009\)](#page-12-8).

One way of remote quantification of photosynthesis by fluorescence relies on making it possible to measure and analyze fluorescence transients at a distance from the target leaf. A newly developed Laser Induced Fluorescence Transient (LIFT) instrument makes use of a telescope to collect light from target leaves and a low power laser to manipulate the light regime of the target. Constraints on the power of lasers for use in open environments make it impossible to use the same protocols that have been used with PAM fluorometers. New approaches make use of the laser to make much smaller but highly replicated modification of the light regime to analyze the efficiency of photosynthesis (Kolber et al. [2005\)](#page-11-14). The LIFT instrument is required to make measurements that are at the noise limit and computer assisted fitting of the data to a theoretical model are substituted for brute force and simple analysis used in PAM fluorometery (Ananyev et al. [2005,](#page-10-12) Kolber et al. [1998\)](#page-11-15). The LIFT approach was successfully used to monitor spatial and temporal dynamics of the photosynthetic properties of leaves in the inaccessible outer canopy of trees (Osmond et al. [2004,](#page-11-13) Rascher and Pieruschka [2008\)](#page-12-9). However, it is limited to measurements at a distance of 5–50 m from the canopy.

2.3 Retrieval of Remotely Measured Sun-Induced Chlorophyll Fluorescence

Fluorescence measurement of large ecosystems relies on passive measurements of solar induced fluorescence (F_s) . The approach uses Fraunhofer lines with reduced incoming solar radiation reaching the Earth surface in three main absorption bands

in the red and near infrared spectral domain: the H α line at 656.3 nm is due to the hydrogen absorption by the solar atmosphere whereas two bands at 687 nm (O₂-B) and 760 nm (O₂-A) are due to the molecular oxygen absorption by the terrestrial atmosphere. Fluorescence originated from the canopy occurs in these otherwise 'black' absorption bands and, therefore, can be selectively quantified. Especially the $O₂$ -A and $O₂$ -B bands overlap with the chlorophyll fluorescence emission spectrum and are wide enough to allow quantifying fluorescence from air- and space-borne platforms. The Fraunhofer Line Discrimination method (FLD) has been proposed for this purpose (Plascyk and Gabriel [1975\)](#page-12-10) and was used with success in different works (Carter et al. [1990,](#page-10-13) Moya et al. [2004,](#page-11-16) Meroni et al. [2009\)](#page-11-12).

Retrieval of sun-induced fluorescence takes advantage of the great difference in incoming radiation in a small spectral window around the atmospheric oxygen absorption lines. Incoming and outgoing radiance is measured on the shoulders outside of the absorption lines and inside the absorption lines. Fluorescence is a spectrally comparably broad signal which is added to the reflected signal and by comparing values inside and outside of the oxygen absorption feature sun-induced fluorescence can be quantified (Fig. [6.4\)](#page-5-0).

Approaches to quantify F_s can be divided in two major categories: radianceand reflectance-based approaches. Radiance-based approaches exploit the narrow absorption feature of a Fraunhofer line and so make use of high spectral resolution data (from few nanometres up to 0.03 nm Full Width at Half Maximum (FWHM)). The main methods proposed in the literature require 2–3 spectral channels near the investigated absorption line, while other three methods require a set of contiguous channels covering the whole spectral range of interest. Reflectance-based approaches on the contrary compute optical indices related to F_s but cannot provide direct F_s estimates, neither in physical nor in auxiliary units. In fact, these

Fig. 6.4 Principle of retrieval of sun-induced fluorescence in the atmospheric absorption lines, where I is incoming radiance and L is reflected, i.e. outgoing radiance, the subscripts 'in' and 'out' refer to radiance inside and outside of the atmospheric absorption lines (courtesy Jose Moreno, University of Valencia)

methods exploit the effect of F_s on the apparent reflectance spectrum in the rededge region (from 650 to 800 nm) and several indices have been proposed for this purpose (Meroni et al. [2009\)](#page-11-12).

Taking the advantages and disadvantages of the different approaches into account and considering several sensitivity studies, the method proposed by Maier et al. [\(2003\)](#page-11-17) may be a good compromise between low complexity and stability among a wide range of applications. According to the common measurement procedure of field spectroscopy, this method needs the hyperspectral reflectance measurement of a white (non-fluorescing) reflectance standard (e.g. a calibrated SpectralonTM panel) that is mounted on the same height as the vegetation or alternatively if applied on the larger scale non-fluorescent surfaces, such as fields of bare soil that are large enough to be not-influences by diffuse fluorescence from adjacent fields. Radiance measurements from the non-reflecting surface are compared with radiance measurements of the fluorescing canopy. Fluorescence can then be calculated according to Eq. [\(2\)](#page-6-0)

$$
F_s = \frac{I_{in} - \frac{L_{in}}{L_{out}} \cdot I_{out}}{1 - \frac{L_{in}}{L_{out}}}
$$
(2)

with I being the incoming radiance, L is the radiance of vegetation, and the subscripts 'in' and 'out' indicate the wavelengths within and outside of the absorption line, respectively (see also Fig. [6.4\)](#page-5-0).

The magnitude of fluorescence emission is primarily driven by the amount of absorbed light in the photosynthetic 'machinery' and secondly depends on the physiological properties of the photosynthesis. If one is interested in the physiological status, the fluorescence signal (F_s) has to normalize by incoming or absorbed light. This can be achieved by rationing the number of photons emitted (F_s) and the number of photons absorbed by the plants (APAR). The resulting signal is termed fluorescence quantum yield (*Fs*yield). Changes in *Fs*yield are independent of the light level and thus reflect the functional status of photosynthesis.

3 Case Studies

3.1 CEFLES-2 Campaign

Field data were acquired as part of the European Space Agency (ESA) supported CEFLES-2 campaign in April, June and September 2007 (http:// www.esa.int/esaLP/SEMQACHYX3F_index_0.html). The campaign was performed in the Les Landes area, Southwest France. The main site is located in a plain of the Garonne valley and dominated by intensive agriculture (Fig. [6.5\)](#page-7-0). CEFLES-2 was designed to provide extensive and spatially resolved validation of photosynthesis estimates based on remote sensing fluorescence measurements obtained by using

Fig. 6.5 Aerial view of the main study site Les Landes in Southern France. The RGB false color image was derived from the Airborne Hyperspectral Scanner (AHS) airborne sensor (R: 855 nm, G: 652 nm, B: 539 nm) on September 15, 2007, around 11:44 local time, close to Marmande. The image dataset was acquired in a flight height of 2,840 m above ground with a spatial resolution of 6 m. Several corn fields (MC) and selected sunflower (SF), potato (MP), grass (MG, MBU), Kiwi (MK) and Rapeseed (MR) field that were intensively characterized for their structure and photosynthetic function are marked

airborne instrumentation. Remotely sensed fluorescence parameter were validated by extensive ground measurements of structural parameters (leaf area index (LAI)), canopy height or fractional cover (f_{cover}) , biochemical characterizations (chlorophyll, water and dry matter content), physiological parameters (PAM fluorometry, gas exchange) and standard field spectroscopy. These more traditional measurements were complemented with novel set-ups aimed to quantify fluorescence at the canopy level. Winter wheat and maize were chosen as species of major interest in April and September, respectively. Additionally, investigations were expanded to rapeseed, grassland, pine, maize, potato, sunflower, bean, kiwi, grapevine and oak forest. A detailed overview of the campaign is published in Rascher et al. [\(2009\)](#page-12-8).

3.2 Characterization of Spatial and Species Dependent Variability of Photosynthesis Using Fluorescence Estimates

Some basic information about the spatial and species dependent variability of canopy fluorescence was investigated covering 36 individual fields in 8 different

crop types, including bare soil. Main focus of this analysis was to investigate the variability of sun-induced fluorescence within the same field, of the same crop, and in different canopies (Fig. [6.5\)](#page-7-0). A comparison of the well established Normalized Difference Vegetation Index (NDVI) and F_s was performed to investigate the plausibility of the derived F_s values. The NDVI typically shows the 'greenness' i.e. the index is a measure for green biomass or canopy chlorophyll content (Goetz and Prince [1999\)](#page-11-18). As fluorescence is also a function of canopy chlorophyll content, we expect that low F_s values correspond to low NDVI values and high F_s values go along with high NDVI values respectively. Important is the dependency of F_s to photosynthesis and F_s covers complementary information about photosynthetic activity. Hence, we also expect a non linear relationship between both parameters.

A first relative evaluation of the data showed that the F_s signal exponentially increases with increasing NDVI (Fig. [6.6\)](#page-8-0). A clear difference in the inter- and intra-field variation was obvious for both parameters. This result is mirroring the heterogeneity of cultivation, nutrient availability, or simple species composition within one field being much lower compared to different fields. Principally, the

Fig. 6.6 Comparison between the NDVI and sun-induced fluorescence (F_s) . Measurements were taken over a wide range of agricultural crops and surface classes. During the three campaigns in April, June, and September 2007, 8 different crops and bare soil were characterized. To cover the spatial heterogeneity of each field, four representative places were selected and three measurements per place were performed. Measurements were taken top-of-canopy using a FieldSpec Pro high resolution spectroradiometer (Analytical Spectral Devices, Boulder,USA), which measures reflected radiation within the spectral domain of 350–2,500 nm with a spectral resolution (FWHM) of 3.0 nm (350–1,050 nm) and a field-of-view (FOV) of 25◦. A calibrated SpectralonTM panel $(25 \times 25 \text{ cm})$ served as white reference to estimate incident irradiance. The fluorescence signal was quantified using the FLD method according to Maier et al. (2003) in the O₂-A band. At each place in the field, the instrument's fibre optic was mounted on a tripod, approximately 1 m above the canopy. Three different spots with a circular area of 0.5 m diameter each were recorded moving the fibre optic manually over the canopy

results seem to describe the status of vegetation: the vital and dense winter wheat fields reach the highest F_s values, slightly senescent corn field medium F_s values and dry stressed grassland and senescent sunflowers have lowest F_s values (Fig. [6.6\)](#page-8-0). Moreover, the sensitivity of both parameters differs especially at the boundaries of the parameter range. On the one hand, the classical vegetation index saturated in dense canopies (e.g. when LAI is higher than 4) at a NDVI value of 0.9, where *Fs* still provided a differentiation of values (e.g. Fig. [6.6,](#page-8-0) for winter wheat). On the other hand, NDVI showed a significant variability for non vegetated surface classes (e.g. bare soil or water). F_s values of non-vegetated surfaces, such as bare soil and burned grass were close to zero, or greatly senescent sunflower field also showed *Fs* slightly below zero (Fig. 6.6).

The relationship between F_s and NDVI indicates that both parameters are driven by canopy chlorophyll content, but also that the fluorescence signal is complementary driven by other parameters and may support the theory that F_s is sensitive to photosynthetic activity. The results clearly show that the observed canopy F_s signal is affected by various structural effects, e.g. canopy structure, fractional cover, or canopy height. A comparison of F_s values from canopies with different structural characteristics and the linkage of derived F_s values to photosynthesis necessitate a proper normalization for the mentioned structural effects.

4 Conclusions

Quantum yield of photosynthetic energy conversion can be related to photosynthetic light use efficiency (LUE), which represents photosynthetic processes, by the amount of fixed carbon per unit of absorbed solar radiation (Genty et al. [1989\)](#page-11-10). Estimation of plant productivity is often based on the linear relationship between net primary productivity (NPP) and the fraction of absorbed PAR (f_{APAR}) , with LUE as the slope of this relationship (Monteith [1972,](#page-11-19) [1977\)](#page-11-20). However, LUE is often estimated from physiological models or look-up tables, and LUE can vary greatly among different vegetation types (Gower et al. [1999,](#page-11-21) Ruimy et al. [1995,](#page-12-11) Weis and Berry [1987\)](#page-12-12). Monitoring of LUE by measurement of sun-induced fluorescence could greatly improve these models.

Crop productivity varies within fields and between fields due to various environmental factors, diseases, and management practices. Photosynthetic efficiency may be a promising parameter to detect limitations or down-regulation of photosynthesis regardless of its cause on thus may serve as an early indicator for reduced productivity. Air- and space-borne fluorescence or hyperspectral sensors may provide spatio-temporal information for better response and managing of crops.

Different studies have shown that fluorescence is somehow related to photosynthesis or LUE, respectively (Damm et al. [2009,](#page-10-14) van der Tol et al. [2009,](#page-12-13) Meroni et al. [2008\)](#page-11-22). However, the existence of non-photochemical quenching mechanisms may influence the relationship of F_s and LUE within a diurnal course and between different species. Understanding the relation of sun-induced fluorescence and photosynthetic efficiency in structurally complex and diverse canopies and ecosystems is extremely complex and challenging but it may provide a very useful tool to quantify productivity of natural and agricultural ecosystems.

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