

## Estimation and mapping transpiration with basal and stress crop coefficients derived from remote sensing and ground-based plant water stress indicator

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### Abstract

The use of remote sensing for obtaining evapotranspiration (ET) from natural and agricultural surfaces is already widely used. For irrigated agriculture the two basic approaches are: (1) the solution of the energy balance equation, using remotely sensed surface temperatures and reflectances to estimate variables and components of this equation, and (2) the crop coefficient and reference evapotranspiration (ET<sub>o</sub>) approach where the crop coefficient is obtained through canopy reflectance measurements. For the latter, theoretical and field studies have shown that satellite reflectance-derived vegetation indices (VIs) are closely relate to carbon and moisture fluxes and, when combined with ground data or appropriately calibrated models, they can produce valuable estimates of crop transpiration and related processes at the canopy or ecosystem scale (D'Urso and Calera, 2006). In this study the crop coefficient approach was used. For estimation of actual transpiration of irrigated and very high tree-density hedgerow orchards grown in Alentejo the procedure correlates (a) the basal crop transpiration coefficients ( $K_{cb} = T_{max}/ET_o$ ) of the unstressed full irrigated treatment to the normalized difference vegetation index (NDVI) values assessed from Landsat5 TM and Landsat7 ETM+ ( $r^2 = 0.86$ ) and (b) the crop stress coefficient ( $K_s = T_a/K_{cb}ET_o$ ), obtained from the ratio of the sustained deficit irrigation ( $T_a$ ) and fully irrigated ( $T_{max}$ ) daily transpiration rates, to a plant stress indicator, in the case, the basal leaf water potential ( $r^2 = 0.85$ ). Daily tree transpiration rates on both treatments were obtained from sap flow measurements. The unstressed crop status of the full irrigation treatment was warranted from the high Willmott index of agreement (IA = 0.88) obtained with transpiration values simulated with the Penman-Monteith "big leaf" model (Willmott, 1982). In this algorithm, a specific model of bulk daily canopy conductance ( $G_c$ ) for unstressed olive canopies was used (Orgaz *et al.*, 2007). From the resulting relationship equations, known field values of leaf basal water potential and satellite-derived NDVI's suffice to get estimates of  $K_s$  and  $K_{cb}$ , respectively and from them derive and map the actual olive tree transpiration ( $T_a = K_{cb} K_s ET_o$ ) rates. The study is under way, and thus further validation applications are planned prior to using the approach for mapping olive transpiration orchards of different tree density and scale areas.

Keywords: *Olea europaea*, transpiration, crop coefficient, hedgerow olive orchard, mapping transpiration

## Estimativa e mapeamento da transpiração com os coeficientes culturais basal e de stress derivados de deteção remota e de indicadores de stress hídrico

### Resumo

O uso da deteção remota para a obtenção de estimativas da evapotranspiração (ET) de superfícies naturais e agrícolas é hoje uma realidade. Para a agricultura de regadio, as duas aproximações mais usadas nessa estimativa são: (1) a solução da equação do balanço de energia, com as temperaturas da superfície e as reflectâncias obtidas por deteção remota, o que garante a estimativa de variáveis e componentes dessa equação, e (2) a obtenção de coeficientes culturais e da evapotranspiração da cultura (ET) com base na evapotranspiração de referência (ET<sub>o</sub>) e na reflectância do copado, esta obtida por deteção remota. Para esta aproximação, os estudos teóricos e experimentais demonstram que os índices de vegetação (VIs), derivados de informação de reflectâncias obtida de imagens de satélite, apresentam elevada correlação com os fluxos de carbono e de vapor de água e que, quando

combinados com dados derivados de ensaios experimentais e de modelos devidamente calibrados, produzem estimativas válidas da transpiração das culturas regadas e de processos com esta relacionados, à escala do copado e do ecossistema. Neste estudo foi usada a aproximação dos coeficientes culturais. Para a estimativa da transpiração actual de pomares de olival superintensivo regados e em sebe na região do Alentejo, o procedimento relaciona (a) valores do coeficiente cultural basal ( $K_{cb} = T_{max}/ET_o$ ) do tratamento de rega plena, em que a cultura é bem abastecida de água, com o índice de vegetação diferença normalizada (the normalized difference vegetation index NDVI) obtido a partir dos sensores Landsat5 TM and Landsat7 ETM+ ( $r^2 = 0.86$ ) e (b) valores do coeficiente de stress hídrico ( $K_s = T_a/K_{cb}ET_o$ ), em que a transpiração máxima da cultura é obtida do tratamento de rega plena ( $T_{max}$ ) e a transpiração actual da situação de rega deficitária sustentada ( $T_a$ ), com indicadores de stress da cultura, no caso, o potencial hídrico de base ( $r^2 = 0.85$ ). Nos dois tratamentos, os valores diários da transpiração do olival foram obtidos através de medições de fluxos de seiva no tronco de árvores. O estado de rega plena e olival bem abastecido de água foi assegurado pelo elevado índice de concordância de Willmott (IA = 0.88) obtido entre os valores de transpiração medidos pelo fluxo de seiva e os derivados com a equação "big leaf" de Penman-Monteith (Willmott, 1982). Neste algoritmo, a condutância estomática diária global do olival foi obtida através do "specific model of bulk daily canopy conductance ( $G_c$ ) for unstressed olive canopies" de (Orgaz *et al.*, 2007). Com as relações estabelecidas em (a) e (b), para se obterem valores de transpiração actual do olival ( $T_a = K_{cb} K_s ET_o$ ) e mapear a sua distribuição temporal, bastará obter valores experimentais de um indicador de stress da cultura (potencial hídrico de base), para daí derivar estimativas de  $K_s$ , e valores do índice de vegetação NDVI, para daí derivar as de  $K_{cb}$ . Mais aplicações e validações estão planeadas para comprovar o uso do modelo no mapeamento global da transpiração de pomares de olival de diferentes densidades e áreas de plantio.

Palavras-chave: *Olea europaea*, transpiração, coeficiente cultural, olival em sebe, mapeamento da transpiração

## Introduction

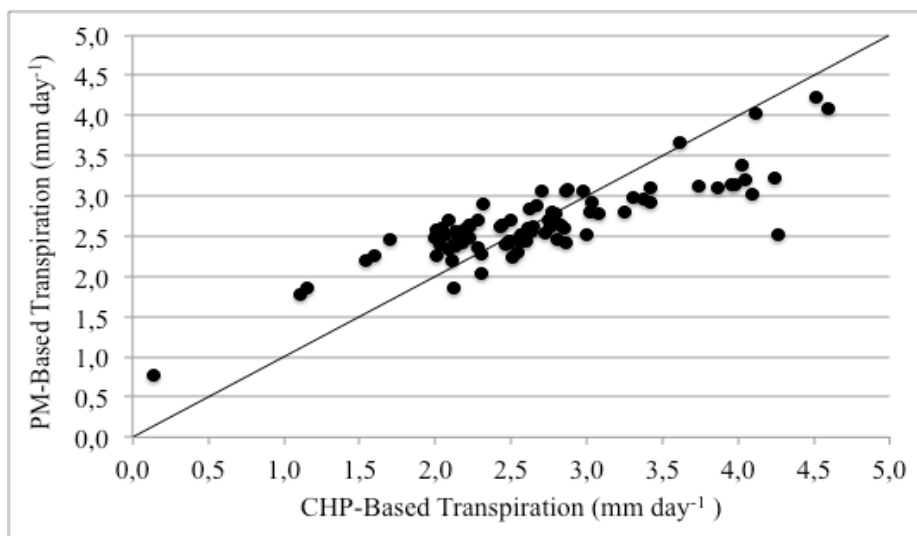
The large demand for water rising from the increasing number of hectares devoted to olive orchards in southern Portugal make the optimal use of irrigation water critical for the sustainability of commercial orchards. A precise estimation of transpiration under non-limiting conditions is required to set the upper limit of irrigation requirements, and to assess the opportunities for reducing transpiration and water applications via deficit irrigation (DI; Santos *et al.*, 2007). This growing need to estimate crop transpiration under water-limiting conditions, i.e., deficit irrigation, is also greatly felt in many dry areas of the world with a shrinking share of agricultural water and current and pressing water allocation issues. The  $K_c$  approach with an empirical  $K_s$  stress coefficient has been proposed and used to describe the effect of water stress on crop transpiration (Allen *et al.*, 1998). Furthermore, crop coefficients are used to help better schedule irrigation and water delivery. Crop coefficient values are also related to canopy development and fractional vegetation cover. Since these vegetation characteristics are well correlated with canopy spectral reflectances, it is possible to establish a correlation between remote multi-spectral observations of uniformly growing crops and corresponding  $K_c$  values derived from field investigations (Bausch and Neale, 1987; Bausch, 1995; Choudhury *et al.*, 1994). They established the potential for modeling crop coefficient as a function of the Normalized Difference Vegetation Index (NDVI) and used this approach to perform irrigation scheduling. On the basis of intensive multi-temporal spectral reflectance acquisitions and simultaneous field evaluations, a linear relationship, relating the basal crop coefficient  $K_{cb}$  and NDVI, has also been defined by D'Urso and Calera (2006). The objective of this study was to develop a simple predictive model to estimate and help map the actual transpiration of irrigated and very high tree-density hedgerow olive orchards in Alentejo taking into account the Normalized Difference Vegetation Index, NDVI and a crop water stress indicator (i.e., the basal leaf water potential), by: (1) correlating the basal crop transpiration coefficients ( $K_{cb} = T_{max}/ET_o$ ) of the unstressed irrigation treatment to NDVI values remotely assessed by Landsat5 TM and Landsat7 ETM+ satellite sensors, and (2) correlating the crop stress coefficient values ( $K_s = T_a/K_{cb}ET_o$ ), a ratio of the sustained deficit irrigation daily transpiration rates ( $T_a$ ) to the corresponding unstressed transpiration ( $T_{max} = K_{cb}ET_o$ ) values, to basal leaf water potential,  $\psi_b$  measurements.

## Material and Methods

The research was conducted during 2012 in the region of Alentejo, Portugal, and in a commercial orchard at the Herdade da Azambuja, Monte do Trigo, near Évora (38° 24' 47.03" N, 7° 43' 38.36" W; alt. 75 m) in a Eutric Cambisol (WRB, 1998). The average apparent bulk soil density was 1,67 Mg m<sup>-3</sup>, and average volumetric soil water content at field capacity (i.e. at 0,03 MPa) was 0,36 m<sup>3</sup> m<sup>-3</sup>, whereas it was 0,12 m<sup>3</sup> m<sup>-3</sup> at wilting point (i.e. at 1,5 MPa). Using an orchard stand of 6 year-old olive trees (*Olea europaea* L. cv. Arbequina) planted on hedgerow in a 3,75 by 1,35 m spacing layout and drip irrigated, the trees were treated from mid-May to the end of October using one of two irrigation treatments: a treatment A with full-rate irrigation to the full soil water holding capacity and continuously replenished, and a SDI treatment B with irrigation to trees to provide for approximately 70% of the water applied in treatment A. Reference evapotranspiration, ETo was calculated using the FAO-Penman–Monteith method and the procedures prescribed by Allen *et al.* (1998). Each tree of treatments A and B were supplied with water by a single drip line with emitters spaced 0,75 m apart throughout the entire length of the emitter line placed at the soil surface and laid out along each tree row, and serviced by 2,3 and 1,6 l h<sup>-1</sup> emitters, respectively. The irrigation scheduling and time of water delivery to trees were the same for both treatments throughout the irrigation cycle. Half-hour averages of the meteorological parameters, wind speed, air temperature, solar radiation, precipitation and relative humidity were evaluated from data recorded in a nearby meteorological station. Half-hour averages of the net radiation above the canopy of the trees were measured using one NrLite net radiometer (Kipp & Konen, Holland) connected to a data logger (Delta-T, DL2e, Delta-T Devices, Cambridge, U.K.). To evaluate sap flow rates and transpiration, three representative trees in each treatment were selected and their trunk implanted with heat-pulse probes. Using the compensation heat-pulse technique (CHP) described in Santos *et al.* (2007), sap flow measurements were taken at 30min intervals and tree transpiration rates were estimated as average sap flow rates of the three probes. Photosynthetically active radiation (PAR) was evaluated using a set of eight Quantum sensors (QPAR-02, 400 – 700 nm, Tranzflo, Palmerston, NZ) placed in a fixed grid around the trees and one at the top of the canopy. Basal leaf water potential,  $\psi_b$  was evaluated in leaves of trees chosen for sap flow measurements with a pressure chamber (PMS Instruments, Corvallis, USA). Acquired radiometrically corrected reflectance values for red and near infrared bands available from the Landsat5 and Landsat7 ETM+ sensors were used as inputs for generating the Normalized Difference Vegetation Index, NDVI. Measured daily transpiration values estimated from sap flow were compared to simulated transpiration values obtained with the Penman-Monteith (PM) “big leaf” equation (Monteith, 1981) coupled with the Orgaz *et al.* (2007) specific model of bulk daily canopy conductance ( $G_c$ ) for unstressed olive canopies (hereafter the PM-Orgaz model).

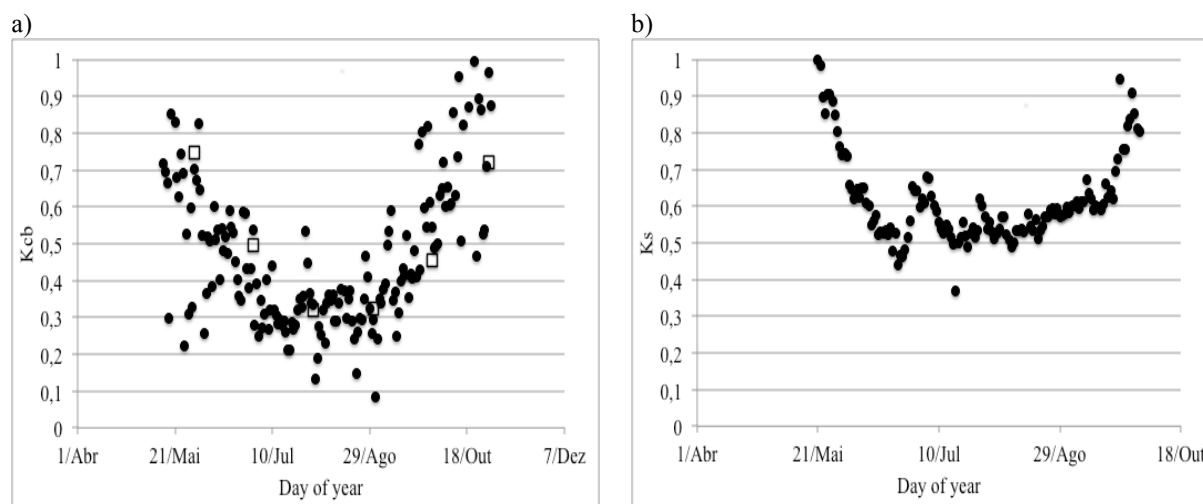
## Results and Discussion

Daily transpiration rates of treatment A estimated from sap flow measurements were highly correlated with the corresponding transpiration values simulated with the PM-Orgaz model (Figure 1). Line 1:1 in the Figure reflects the good match between the observed and simulated values, demonstrating that the PM-Orgaz model was able to capture the variations in the seasonal pattern of the well-watered transpiration rates of treatment A. Also, the high Willmott index of agreement IA of 0,8, and the low root-mean-square error RMSE of 0,4 mm d<sup>-1</sup> (Willmott, 1982) corroborates the goodness-of-fit, securing that treatment A was well irrigated. Treatment A average maximum and minimum daily transpiration rates were 4,2 and 0,8 mm d<sup>-1</sup>, and 4,6 and 0,2 mm d<sup>-1</sup> with the PM-Orgaz simulation model, respectively. Irrigation applied water between 1 June and 30 September were 296 and 206 mm for treatment A and B, respectively.



**Figure 1. Observed (CHP-based) and derived (PM-Orgaz based) transpiration ( $\text{mm d}^{-1}$ ) rates for hedgerow olive orchard grown in southern Portugal. Solid line is the 1:1 line**

The basal transpiration coefficient  $K_{cb}$  for treatment A, the ratio of crop transpiration over reference evapotranspiration ( $T_{\max}/ETo$ ) when the soil surface is dry and transpiration is occurring at a non-water-limiting rate, during summer (1 June to 30 September) was 0,398, with a maximum of 0,975 and a minimum of 0,082, but highly variable (Figure 2a) and with a marked increase at the end of summer and onwards. The variability was also high during spring. The U shape is a characteristic of olive trees (Testi *et al.*, 2005). According to Allen *et al.* (1998), under water stress standard transpiration ( $T_{\max}$ ) is usually reduced and the crop coefficient  $K_{cb}$  must be adjusted to those conditions using a stress coefficient  $K_s$ . The adjusted transpiration,  $T_a$  is the product of  $K_{cb}$ ,  $K_s$ , and  $ETo$ .  $K_s$  is also often used in the management of deficit irrigation regimes to adjust the upper limit of irrigation requirements to reflect the soil water limiting conditions. The evolution of  $K_s$  stress coefficients values obtained for treatment B during summer is shown in Figure 3b. The average  $K_s$  was 0,691, with a maximum of 0,92 and a minimum of 0,462, corroborating the steadily decline in transpiration rates of treatment B from June to September, when transpiration dropped to 59% of treatment A.



**Figure 2. Time series of (a) coefficient of transpiration  $K_{cb}$  (the ratio of crop transpiration over reference evapotranspiration, or  $T/ETo$ ) for the unstressed treatment A, and (b) the coefficient of stress  $K_s$  (the ratio of stressed to unstressed crop transpiration) for deficit irrigation treatment B.**

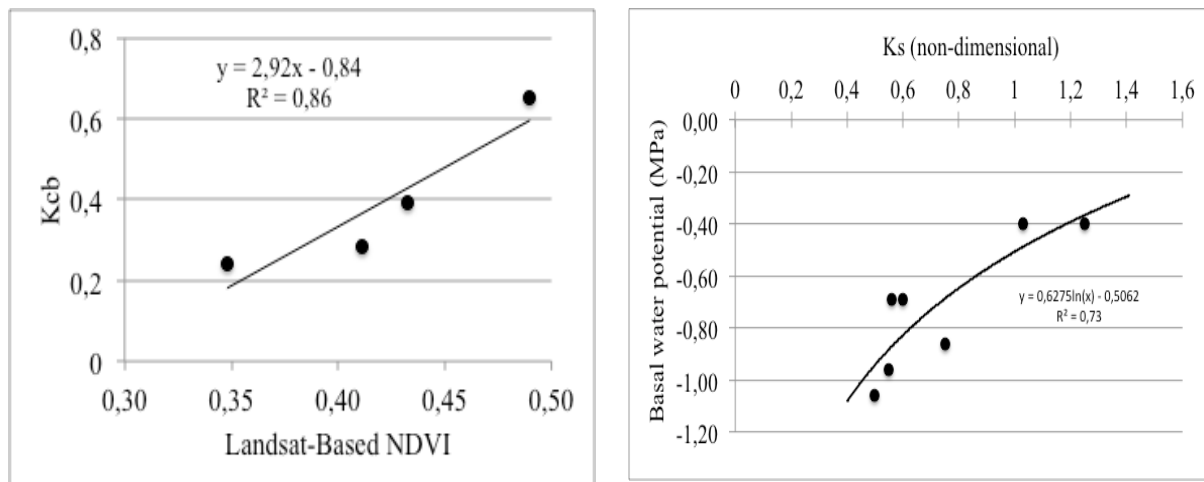
Figure 3a plots the relationship between  $K_{cb}$  and the Landsat based NDVI ( $R^2=0,86$ ) for the unstressed treatment A and shows the linear Equation 1,

$$K_{cb} = 2,9 \text{ NDVI} - 0,84 \quad (1)$$

required to predict  $K_{cb}$  known corresponding values of NDVI. Figure 3b plots a similar relationship between  $K_s$  and the basal leaf water potential ( $R^2=0,73$ ), showing the logarithmic Equation 2,

$$K_s = 0,63 \ln(\psi_b) - 0,51 \quad (2)$$

also required to predict  $K_s$  known corresponding values of  $\psi_b$ .



**Figure 3. Scatter plot for (a) calculated basal crop coefficient  $K_{cb}$  and the corresponding Landsat-based NDVI values, and for (b) calculated stress coefficient  $K_s$  and the corresponding basal leaf water potential (MPa) for a hedgerow olive orchard grown in southern Portugal**

## Conclusions

From the resulting relationships in Equations 1 and 2, known field values of basal leaf plant water potential,  $\psi_b$  and satellite-derived NDVI's suffice to get estimates of  $K_{cb}$  and  $K_s$ , respectively and from them derive and map the actual olive tree transpiration ( $T_a = K_{cb} K_s ET_0$ ) rates. The study is under way, and thus further validation applications are planned prior to using the approach for mapping olive transpiration orchards of different tree density and scale areas.

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