

Assessing temporal variation of primary and ecosystem production in two Mediterranean forests using a modified 3-PG model

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Abstract

• **Context** Forest ecosystem carbon uptake is heavily affected by increasing drought in the Mediterranean region.
• **Aims** The objectives of this study were to assess the capacity of a modified 3-PG model to capture temporal variation in gross primary productivity (GPP), and ecosystem net carbon uptake (NEE) in two Mediterranean forest types.

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• **Methods** The model was upgraded from a monthly (3-PG) to a daily time step (3-PG_{day}), and a soil water balance routine was included to better represent soil water availability. The model was evaluated against seasonal GPP and NEE dynamics from eddy covariance measurements.

• **Results** Simulated and measured soil water content values were congruent throughout the study period for both forest types. 3-PG_{day} effectively described the following: GPP and NEE seasonal patterns; the transition of forest ecosystems from carbon sink to carbon source; however, the model overestimated diurnal ecosystem respiration values and failed to predict ecosystem respiration peaks.

• **Conclusions** The model served as a rather effective tool to represent seasonal variation in gross primary productivity, and ecosystem net carbon uptake under Mediterranean drought-prone conditions. However, its semi-empirical nature and the simplicity inherent in the original model formulation are obstacles preventing the model working well for short-term daily predictions.

Keywords Carbon balance · Forest · Ecosystem · Mediterranean · Drought · Model

1 Introduction

Climatic projections predict significant increases in temperature and decreases in precipitation, in the Mediterranean basin, making it a highly vulnerable area (IPCC 2007). In particular, Mediterranean forest vegetation is forecast to undergo continual change as a result of the interacting effects of climatic and land use changes, with likely effects on hydrological balance at the watershed and regional scale, and the supply of ecosystem services (Giorgi 2006; Vitale et al. 2012). Recent reviews and experimental evidence highlighted the potential of water stress to

cause extensive forest dieback (Anderegg et al. 2012) and the vulnerability of Mediterranean forest trees to severe summer droughts (Nardini et al. 2013).

Transition from positive to negative carbon balance in Mediterranean forest ecosystems, as a consequence of increasing environmental constraints, is a crucial process which might have profound consequences on forest persistence and forest vegetation dynamics. For this reason, carbon uptake as a functional response to climatic variables is pivotal information to forecast the effects of climate change, evaluate the potential of forest vegetation in drought-prone environments, and design conservation strategies from an adaptive management perspective (Lindner et al. 2010).

Process-based models are the most feasible way to assess functional responses to climatic variables over large spatial and temporal scales, and to estimate the influence of key physiological and environmental factors on forest ecosystem carbon balance and growth processes. Models vary in complexity and scale of application, and their applicability is related to the spatial and temporal resolution of represented processes. In general, smaller time steps and finer spatial resolution increase the number of parameters required to run models, and determine the need for a finer input data set. Therefore, it is advisable to refine simple models to allow estimates over a wide range of forest ecosystems, with a limited number of required parameters and data input.

The 3-PG forest growth model proposed by Landsberg and Waring (1997) is a widely applied, simple process-based model, which has been frequently chosen for its suitability and relative simplicity in reproducing forest vegetation processes and their dependence on environmental constraints. Based on the canopy radiation-use efficiency concept (Monteith 1977), 3-PG estimates forest growth by assuming maximum canopy assimilation capacity is a fixed value for a given vegetation type, further modulated by environmental constraints, such as temperature, air vapour pressure deficit, and soil water availability. Due to the limited number of input variables and parameters required, 3-PG has been applied to a number of forest ecosystems from widely variable climate and site conditions (e.g. Law et al. 2000; Makela et al. 2008).

In some applications, the model has been modified by exclusion or introduction of sub-models. For example, 3-PG was developed towards a remotely sensed driven version to produce forest productivity estimates at the regional scale using satellite-derived data (Coops et al. 1998; Tickle et al. 2001); or modified by the introduction of a soil respiration routine to estimate ecosystem net productivity (e.g. Nolè et al. 2009); in other cases, 3-PG was combined with soil organic matter decomposition sub-models to represent soil carbon dynamics (Xenakis et al. 2008).

The monthly time step basis of the 3-PG model, including a monthly average climatic input data set, can be considered a major simplification and reduces its potential to portray ecosystem carbon balance dependence on short-term weather patterns, as observed in Mediterranean ecosystems (Chiesi

et al. 2012; Pereira et al. 2007). An improved 3-PG capability to describe soil water balance should also be viewed as an important model feature to interpret forest growth as a function of soil water dynamics, and possibly extend model use to catchment water balance estimates (Feikema et al. 2010).

During the last two decades, our capability to validate predictive process-based models of ecosystem carbon balance and productivity has substantially been improved by the availability of large scale data sets generated by eddy covariance flux measurements, performed over a broad range of forest types worldwide (McCarthy et al. 2012).

As a result of the above considerations and opportunities, the specific objectives of our study were to assess the capability of a modified 3-PG model to capture the temporal variation in gross primary productivity (GPP) and ecosystem net carbon uptake (NEE) in Mediterranean forest ecosystems. The effects of soil water availability on assimilation processes and productivity were better represented by upgrading the model from a monthly to daily time step, and enriching the model with an improved soil water balance routine. Following these modifications, the model was evaluated against 3-year seasonal GPP and NEE dynamics from eddy covariance flux measurements performed at two Mediterranean forest types in Italy.

2 Materials and methods

2.1 Model description

Our current 3-PG model version, 3-PG_{day} that operates on a daily basis, retained the original 3-PG assumptions and equations (see Landsberg and Waring 1997; Coops et al. 1998) to calculate canopy gross primary production (GPP). GPP was determined as the product of radiation intercepted by the canopy, and radiation-use efficiency for carbon fixation:

$$\text{GPP} = \text{aPAR} \cdot \varepsilon_{\text{max}} \cdot f_x \quad (1)$$

where aPAR is canopy absorbed photosynthetic active radiation, ε_{max} is the biome-specific constant for radiation-use efficiency, and f_x is the summary modifier for environmental constraints, obtained as the product of single environmental modifiers; canopy aPAR was estimated as the product of daily totals incident PAR and MODIS-derived f_{PAR} (see below for details on MODIS data).

For our modelling exercise, environmental constraints on GPP included air temperature, available light, air vapour pressure deficit, and available soil water, with corresponding modifiers respectively denoted as f_L , f_D , f_θ , f_T . The summary modifier f_x ranges were between zero (system totally constrained) and 1 (no constraint acting on the system). All modifiers were calculated on a daily basis.

Here we report the basic modifier estimate equations; a list of equation parameters, with their descriptions and values used in the simulations, is given in Table 1.

The temperature modifier (f_T) was calculated following Sands and Landsberg (2002):

$$f_T = \left(\frac{T_{av} - T_{min}}{T_{opt} - T_{min}} \right) \times \left(\frac{T_{max} - T_{av}}{T_{max} - T_{opt}} \right)^{\left(\frac{T_{max} - T_{opt}}{T_{opt} - T_{min}} \right)} \quad (2)$$

where T_{av} is the average daily air temperature, and T_{min} , T_{max} , and T_{opt} are respectively minimum, maximum, and optimum air temperatures for photosynthesis.

The effects of gradual GPP saturation with increasing irradiance (e.g. Baldocchi and Harley 1995) were included, applying a light modifier (f_L), and integrated as a hyperbolic function of absorbed photosynthetic active radiation (aPAR), using the derivation reported by Makela et al. (2008):

$$f_L = \frac{1}{\xi \cdot aPAR + 1} \quad (3)$$

where ξ is an empirical parameter.

The vapour pressure deficit modifier (f_D) was calculated following the original work of Landsberg and Waring (1997):

$$f_D = \exp(-k \cdot D) \quad (4)$$

where D is the daily average of air vapour pressure deficit, and k is an empirical coefficient, which accounts for the effect of D on stomatal conductance.

Finally, the soil water modifier (f_θ) was assessed as follows:

$$f_\theta = \frac{1}{1 + \left[(1 - REW) / c \right]^n} \quad (5)$$

where c and n are soil type-related parameters (clay soil, $c=0.4$, $n=3$; clay loam soil, $c=0.5$, $n=5$; sandy loam soil, $c=0.6$, $n=7$; sand soil, $c=0.7$, $n=9$; Landsberg and Waring 1997), and REW is the soil relative extractable water, calculated on a daily basis as:

$$REW = \text{MIN} \left[\frac{SWC_d - SWC_{WP}}{SWC_{FC} - SWC_{WP}}; 1 \right] \quad (6)$$

where SWC_d is soil water content at day d , SWC_{FC} and SWC_{WP} are soil water at field capacity, and at permanent wilting point, respectively.

SWC_d , SWC_{FC} , and SWC_{WP} estimates were derived from the newly introduced soil water balance routine. SWC_{FC} was computed as follows:

$$SWC_{FC} = 1 - \frac{\rho_b}{\rho_s} \quad (7)$$

where ρ_b and ρ_s are soil bulk density and soil particle density, respectively.

SWC_{WP} was determined as available soil water when soil water potential (Ψ_s) is -1.5 MPa (Campbell and Norman 1998); Ψ_s was calculated as proposed by Campbell (1985):

$$\Psi_s = \Psi_e \left(\frac{SWC_d}{SWC_{FC}} \right)^{-b} \quad (8)$$

where Ψ_e is the soil water potential at the point of air entry, given by:

$$\Psi_e = \frac{-5}{\sqrt{d_g}} (2SWC_{FC})^{-b} \quad (9)$$

where the texture-dependent empirical coefficient, b , is calculated as a function of the geometric mean particle diameter d_g and standard deviation σ_g , based on the bimodal lognormal model proposed by Shinozawa and Campbell (1991), where S and C represent the fraction of silt and clay, respectively, applying the following equations:

Table 1 Main environmental characteristics of study sites

| | Castelporziano | Arca di Noè-Le Prigionette |
|--|----------------------|----------------------------|
| Geographic location | Central Italy | Sardinia |
| Latitude, longitude | 41° 45' N, 12° 22' E | 40° 36' N, 8° 9' E |
| Altitude (m a.s.l.) | 7 | 74 |
| Mean temperature 2005–2007 (°C) | 15.5 | 15.9 |
| Mean annual rainfall 2005–2007 (mm) | 740 | 588 |
| Forest type | Holm oak (>90 %) | Mediterranean maquis |
| Canopy leaf area index (m ² m ⁻²) | 3.5 | 2.8 |
| Soil depth (m) | 0.5 | 1 |
| Soil texture (clay, sand, silt, %) | 5.4, 89.6, 5 | 74.3, 12.7, 13.0 |

Further information on study sites can be found at the following URL: <http://www.fluxnet.ornl.gov/fluxnet/sitepage.cfm?SITEID=534> (Castelporziano); <http://www.fluxnet.ornl.gov/fluxnet/sitepage.cfm?SITEID=2633> (Arca di Noè-Le Prigionette)

$$b = \frac{10}{\sqrt{d_g}} + 0.2\sigma_g \quad (10)$$

$$d_g = \exp(5.756 - 3.454 \cdot S - 7.712 \cdot C) \quad (11)$$

$$\sigma_g = \exp\left\{\left[33.14 - 27.84 \cdot S - 29.31 \cdot C - (\ln d_g)^2\right]^{1/2}\right\} \quad (12)$$

SWC_d was calculated as SWC at day $d-1$, updated with daily soil water balance given by the difference between daily precipitation (P_d), and daily evapotranspiration (E_d); the excess water is assumed to run off the system if SWC_d exceeds SWC_{FC} :

$$ASW_d = \text{MIN}\{ASW_{d-1} + P_d - ET_{d-1}; ASW_{FC}\} \quad (13)$$

Daily evapotranspiration was computed using the Penman-Monteith combination equation:

$$E_d = \frac{1}{\lambda} \cdot \frac{\Delta \cdot R_n + (\rho_a \cdot c_p \cdot D) \cdot g_{bl}}{\Delta + \gamma(1 + g_{bl}/g_c)} \quad (14)$$

where Δ is the rate of saturation specific humidity change with temperature, R_n is net radiation, ρ_a is dry air density, c_p is specific heat capacity of air, D is vapour pressure deficit, λ is the latent heat of vaporization, γ is the psychrometric constant, and g_{bl} and g_c are a boundary layer and the canopy conductance, respectively.

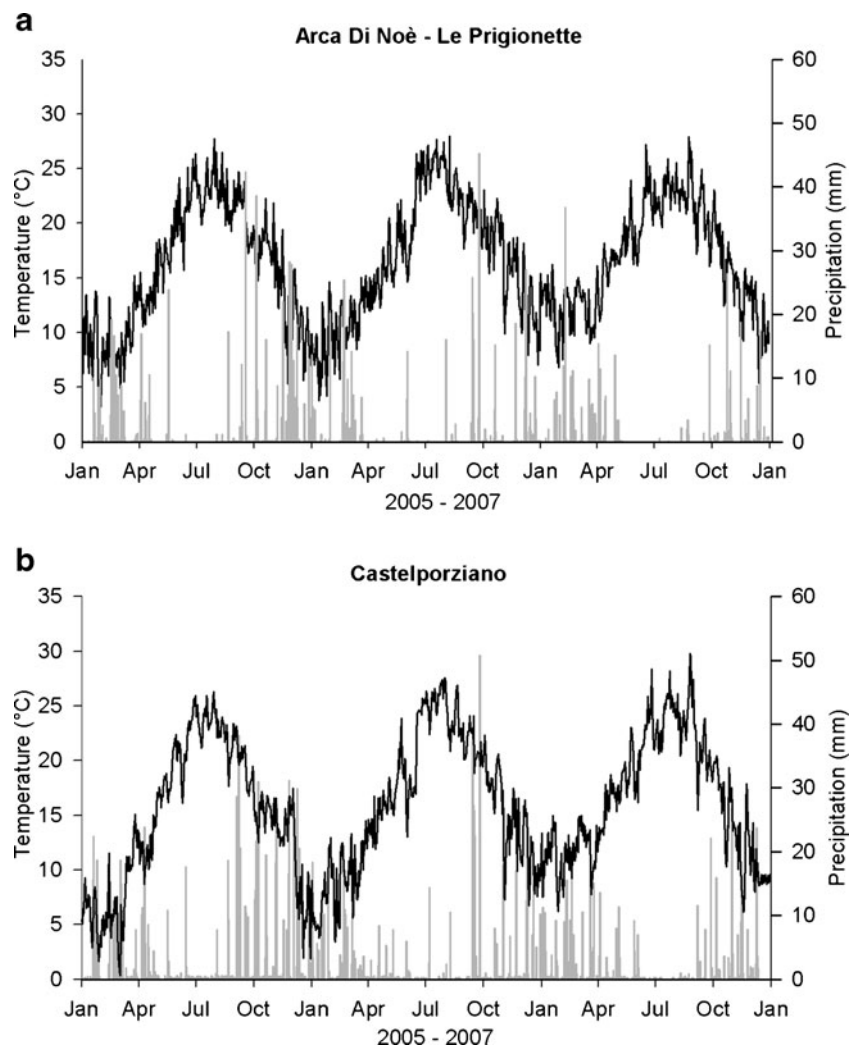
The canopy conductance g_c was calculated, according Landsberg and Waring (1997), using the following expressions:

$$g_{c-opt} = \text{MIN}\left\{\left(g_{s-opt} \cdot LAI\right); g_{c-max}\right\} \quad (15)$$

$$g_c = g_{c-opt} \cdot f_{D-\theta} \cdot f_T \quad (16)$$

where g_{s-opt} is optimal stomatal conductance, g_{c-max} is maximum canopy conductance, g_{c-opt} is optimal canopy conductance, and $f_{D-\theta}$ and f_T are previously defined modifiers.

Fig. 1 Seasonal daily temperature ($^{\circ}\text{C}$) and precipitation (millimeters) patterns reported at study sites during 2005, 2006, and 2007; **a** Arca di Noè-Le Prigionette. **b** Castelporziano



Vapour pressure deficits and available soil water independently affect carbon dioxide uptake via their effects on stomatal conductance; in 3-PG_{day} the effects of these parameters were accounted for by a modifier ($f_{D-\theta}$), which represented, at each moment, the minimum value between f_D and f_θ :

$$f_{D-\theta} = \text{MIN}(f_D; f_\theta) \quad (17)$$

Net ecosystem exchange (NEE) was estimated as the difference between GPP and ecosystem respiration (R_{eco}), where R_{eco} is the sum of autotrophic (R_a , including above- and below-ground components), and heterotrophic (R_e) respiration, i.e.:

$$\text{NEE} = \text{GPP} - R_{\text{eco}} \quad (18)$$

$$R_{\text{eco}} = R_a + R_e \quad (19)$$

Following the original assumption (Landsberg and Waring 1997), R_a was considered a constant GPP fraction, as follows:

$$R_a = 0.53 \cdot \text{GPP} \quad (20)$$

Reichstein et al. (2003) estimated soil respiration (R_{soil}) as a function of soil temperature and soil water availability:

$$R_{\text{soil}} = R_{\text{ref}} \cdot f(T_{\text{soil}} \cdot \text{RWC}_{\text{soil}}) \cdot g(\text{RWC}_{\text{soil}}) \quad (21)$$

where R_{ref} is soil respiration under standard conditions ($T_{\text{soil}}=18^\circ\text{C}$ and non-limiting water), T_{soil} is soil temperature, RWC_{soil} is soil relative water content (i.e. ratio between soil

water content at a given time, and soil water content at field capacity), and f and g are empirical parameters.

Soil respiration estimated by (Eq. 21) includes both heterotrophic and autotrophic contributions to soil respiration. This introduced the problem of double accounting the autotrophic component of soil respiration, which is already computed by the model as a constant fraction of GPP (Eq. 20). In this study, soil heterotrophic respiration was assumed to be 55 % of the total soil respiration based on recent experimental evidence, including Mediterranean forest ecosystems (Tedeschi et al. 2006; Keith et al. 2009), and supported by a review (Bond-Lamberty et al. 2004), which summarized soil respiration data from different forest types under different climatic conditions. Therefore, NEE was computed as follows:

$$\text{NEE} = \text{GPP} - (R_a + 0.55 \cdot R_{\text{soil}}) \quad (22)$$

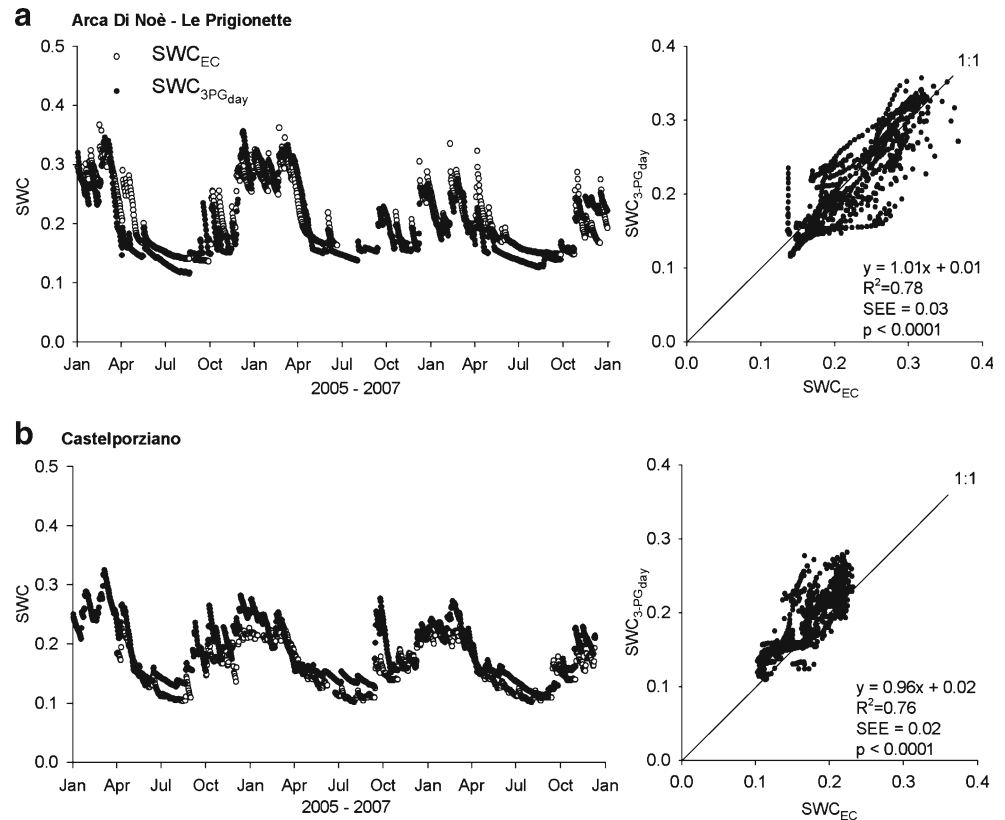
2.2 Study sites

The model was applied to simulate temporal GPP and NEE patterns at two Mediterranean sites in Italy: Castelporziano in Central Italy, and Arca di Noè-Le Prigionette in Sardinia. See Table 1 for site geographic characteristics, and Fig. 1 for weather patterns during the study period. In Castelporziano, the vegetation type is characterized as an evergreen holm oak (*Quercus ilex* L.) dominated forest with scattered *Quercus suber* L. trees; in Arca di Noè-Le Prigionette, the vegetation is Mediterranean maquis in which *Juniperus phoenicea* L., *Pistacia lentiscus* L., and *Phyllirea angustifolia* L. are the

Table 2 List of parameters in model equations

| Parameter | Symbol | Unit | Value | Reference |
|--|---------------------------|--------------------------------------|--------|-----------------------------|
| Radiation-use efficiency, max | ϵ_{max} | G C mol _{PAR} ⁻¹ | 0.35 | Landsberg and Waring (1997) |
| Stomatal conductance sensitivity to D | k | Mbar ⁻¹ | 0.05 | Xenakis et al. (2008) |
| Minimum temperature for tree growth | T_{min} | °C | 0 | Hoff et al. (2002) |
| Maximum temperature for tree growth | T_{max} | °C | 40 | Hoff et al. (2002) |
| Optimal temperature for tree growth | T_{opt} | °C | 20 | Hoff et al. (2002) |
| Light modifier parameter | ξ | Dimensionless | 0.0437 | Makela et al. (2008) |
| Relative soil water modifier | α | Dimensionless | 1.062 | Makela et al. (2008) |
| Relative soil water modifier (exponential) | ν | Dimensionless | 11 | Makela et al. (2008) |
| Maximum canopy conductance | $g_{\text{c-max}}$ | ms ⁻¹ | 0.02 | Breuer et al. (2003) |
| Optimal stomatal conductance | $g_{\text{s-opt}}$ | ms ⁻¹ | 0.004 | Breuer et al. (2003) |
| Canopy boundary layer conductance | g_{bl} | ms ⁻¹ | 0.2 | Sands and Landsberg (2002) |
| GPP/NPP ratio | $\gamma_{\text{GPP/NPP}}$ | Dimensionless | 0.47 | Landsberg and Waring (1997) |
| Reference soil respiration | R_{ref} | μmol m ⁻² s ⁻¹ | 5.13 | Reichstein et al. (2003) |
| Lower temperature for soil respiration | T_0 | °C | -46 | Reichstein et al. (2003) |
| RWC for half-maximum soil respiration | $\text{RWC}_{1/2}$ | Dimensionless | 0.16 | Reichstein et al. (2003) |
| Activation energy E_0 parameter | a_{rew} | K ⁻¹ | 52.4 | Reichstein et al. (2003) |
| Activation energy E_0 parameter | b_{rew} | K ⁻¹ | 285 | Reichstein et al. (2003) |

Fig. 2 Seasonal daily soil water content (SWC) patterns predicted by 3-PG_{day} (SWC_{3-PG_{day}}), and soil water content (SWC_{EC}) measured at the study sites during 2005, 2006, and 2007; **a** Arca di Noè-Le Prigionette. **b** Castelporziano; *SEE* standard error of the estimate



prevailing species. The two study sites were well differentiated by their soil physical characteristics, both in terms of soil depth and soil texture (sandy soil in Castelporziano and clay soil in Arca di Noè-Le Prigionette).

2.3 Input variables and simulation procedures

Input meteorological variables included daily averages of air (T_{air}) and soil (T_{soil}) temperatures, daily averages of air vapour pressure deficit (D), daily precipitation (P), daily totals of short-wave global radiation total (R_{sw}) and incident photosynthetic active radiation (PAR), and daily values of soil water content (SWC). Both study sites host eddy covariance flux towers, and all meteorological variables were obtained from *High Quality Level 4* data sets in the European Fluxes Database Cluster database, available at the following URL: <http://gaia.agraria.unitus.it>. The same data source provided information on soil characteristics, including soil depth, texture, and water holding capacity.

Canopy leaf area index and the fraction of photosynthetically active radiation absorbed by the canopy (f_{PAR}) were derived from MODIS products (MOD15A2 Leaf Area Index-FPAR), available for downloading at the following URL: https://lpdaac.usgs.gov/products/modis_products_table. Canopy absorbed PAR (aPAR) was estimated as the product of incident PAR and MODIS-derived f_{PAR} .

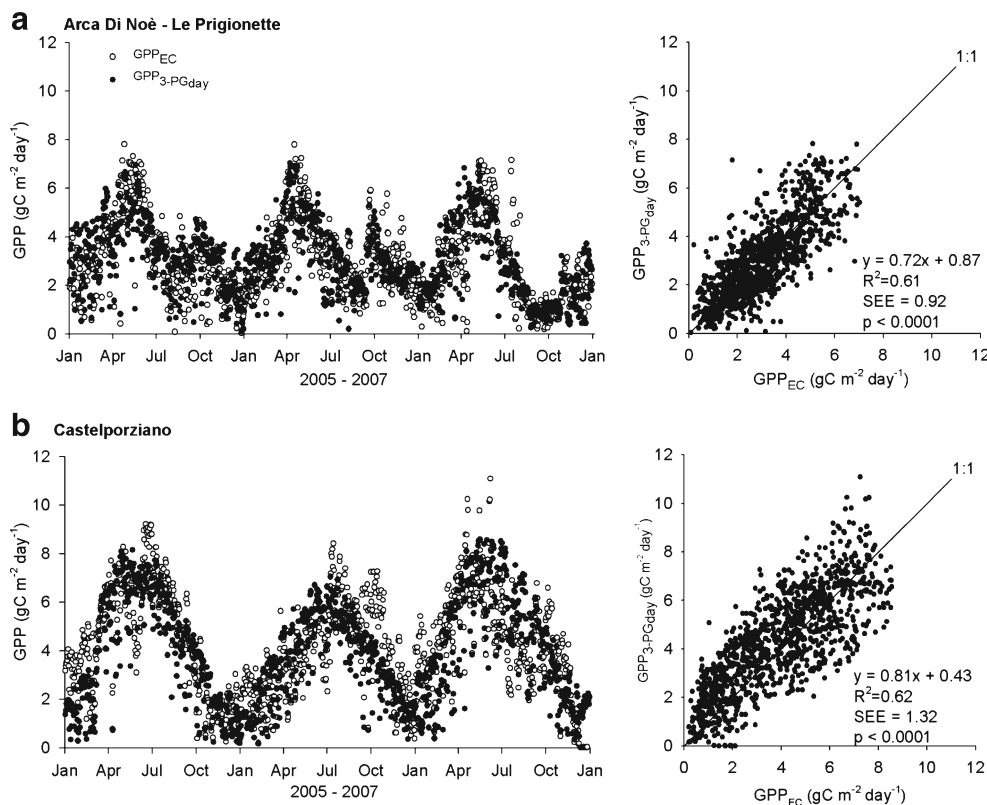
The model was applied to estimate temporal patterns of GPP and NEE over 3 years (2005, 2006, and 2007). At both sites, the model was initialized using field measurements of soil water content on January 1, 2005; subsequently, the model was initialized by calculating soil water balance, and converted into the soil water modifier (Eq. 5). The model successively calculated the other environmental modifiers required to estimate GPP and NEE as previously described. The model was parameterized using values derived from the literature. No calibration or tuning of model parameters using site measurements was done. The only site-specific parameters, measured at the study sites, were related to soil characteristics (soil texture and soil depth). Model parameters are listed in Table 2).

2.4 Validation data and model performance

Model results were compared to daily soil water content and eddy covariance (EC) flux measurements performed at the two study sites over 3 years (2005–2007); daily net ecosystem exchange (NEE_{EC}) and ecosystem respiration ($R_{\text{eco-EC}}$) data were retrieved from the *High Quality Level 4* data sets in the CarboEuropeIP database, and GPP_{EC} was calculated according to the following algebraic sum:

$$\text{GPP}_{\text{EC}} = \text{NEE}_{\text{EC}} + R_{\text{eco}} \quad (23)$$

Fig. 3 *Left panels:* seasonal patterns of daily gross primary production (GPP) predicted by 3-PG_{day} (GPP_{3-PGday}), and gross primary production (GPP_{EC}) measured at the study sites during 2005, 2006, 2007. *Right panels:* linear regression between GPP_{3-PGday} and GPP_{EC}. **a** Arca di Noè - Le Prigionette; **b** Castelporziano; *SEE* standard error of the estimate



Model performance was assessed by considering the absolute model bias (Bias), and the coefficient of determination (R^2), calculated as follows:

$$\text{Bias} = \sum_{i=1}^n (y_i - \hat{y}) / n \quad (24)$$

$$R^2 = \frac{\sum_{i=1}^n (y_i - \hat{y})^2}{\sum_{i=1}^n (y_i - \bar{y})^2} \quad (25)$$

where y_i is the measured value, \hat{y} is the estimated (modelled) value, and \bar{y} is the average of the measured y values.

3 Results

Our 3-PG model, including the soil water balance routine, realistically simulated temporal variation in soil water content (SWC). At both study sites, simulated and measured SWC values agreed well throughout the entire study period, with significant linear relationships, and rather coincident peaks and troughs (Fig. 2).

The model effectively described GPP (Fig. 3) and NEE (Fig. 4) seasonal patterns at both study sites throughout 2005,

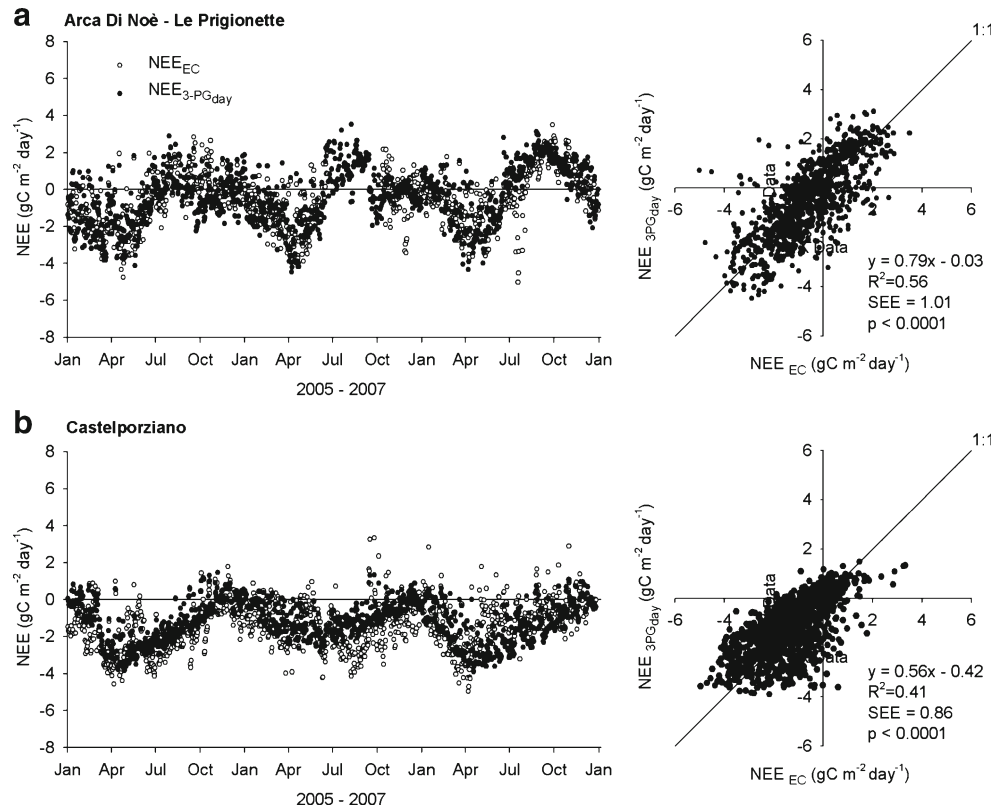
2006, and 2007. It is noteworthy that the model accurately represented long-term seasonal patterns. As for short-term (over a few days) temporal variation, the model captured minor GPP peaks that occurred following rainfall during autumn 2005 and 2006 in Arca di Noè-Le Prigionette; however, it missed the peaks in July 2005 and November 2006 at Castelporziano. The transition of both forest communities from a carbon sink to a carbon source, under summer heat and rainfall deficits, was effectively represented (Fig. 4); NEE ranged between -4 and 2 , and -8 and $2 \text{ g C m}^{-2} \text{ day}^{-1}$ in Arca di Noè-Le Prigionette and Castelporziano.

The model captured seasonal ecosystem respiration (R_{eco}) patterns satisfactorily; however, it failed to predict short-term anomalies (Fig. 5).

Annual totals of GPP, NEE, and R_{eco} are reported in Table 3. Results were congruent with measured and modelled values at both sites for the entire study period.

Model performance was further assessed by plotting 8-day aggregated Bias (Eq. 24) values against main environmental variables (air temperature, T_{air} ; relative soil water content, RSW_{soil} ; fraction of absorbed photosynthetic active radiation, f_{PAR} ; soil temperature, T_{soil}). Despite the rather large environmental range explored, no significant relationship was detected between simulated variables (GPP, NEE, R_{eco}) Bias and environmental variables (Figs. 6, 7, and 8). Variation in R^2 estimator (Eq. 25) was successively used to describe the correlation strength between modelled and

Fig. 4 *Left panels:* seasonal patterns of daily net ecosystem exchange (NEE) predicted by 3-PG_{day} (NEE_{3-PGday}), and net ecosystem exchange (NEE_{EC}) measured at the study sites during 2005, 2006, and 2007; *right panels:* linear regression between NEE_{3-PGday} and NEE_{EC}. **a** Arca di Noè-Le Prigionette; **b** Castelporziano; *SEE* standard error of the estimate



measured values. R^2 variation as a T_{air} , RWC_{soil} , and f_{PAR} function suggests the GPP and NEE model predictions were

weaker with increasing temperature and decreasing relative soil water content (Fig. 9).

Fig. 5 *Left panels:* seasonal daily ecosystem respiration (R_{eco}) predicted by 3-PG_{day} ($R_{\text{eco}3\text{-PGday}}$), and ecosystem respiration (R_{ecoEC}) measured at the study sites during 2005, 2006, and 2007; *right panels:* linear regression between $R_{\text{eco}3\text{-PGday}}$ and R_{ecoEC} . **a** Arca di Noè-Le Prigionette; **b** Castelporziano; *SEE* standard error of the estimate

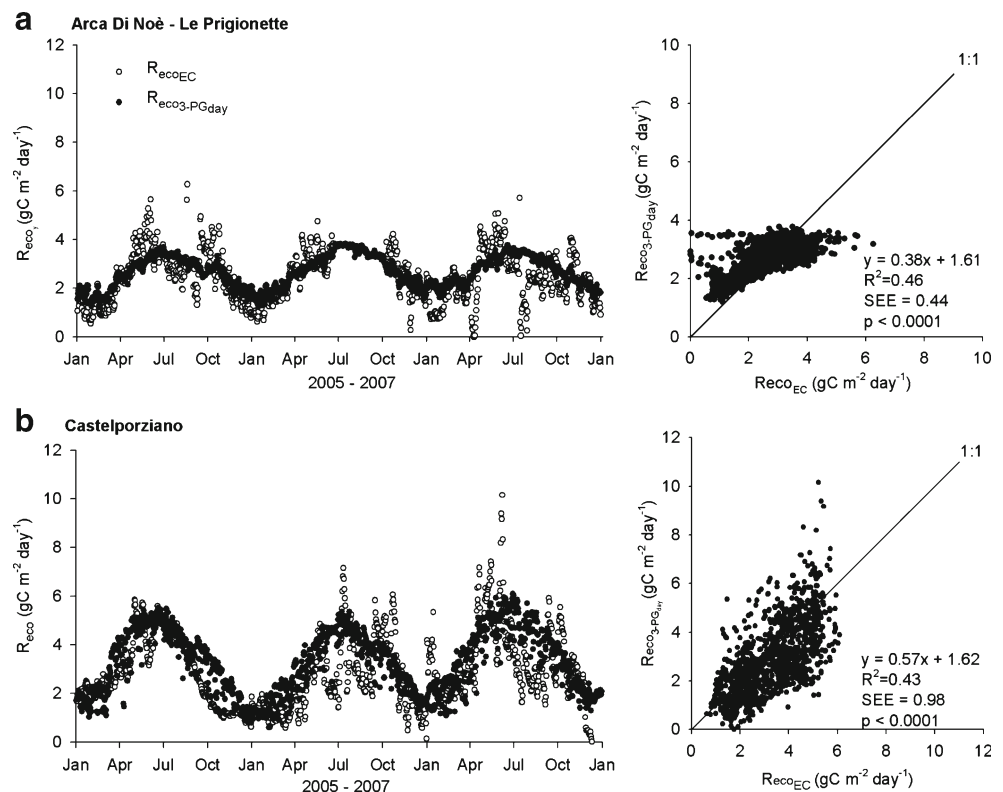


Table 3 Annual values (grams of C per square meter per year) of measured (EC subscript) and modeled (3-PGday subscript) GPP (gross primary production), NEE (net ecosystem exchange), and R_{eco} (ecosystem respiration) at Arca di Noè–Le Prigionette and Castelporziano study sites during 2005, 2006, and 2007

| | Arca di Noè–Le Prigionette | | | Castelporziano | | |
|------------------|----------------------------|-------|------|----------------|-------|-------|
| | 2005 | 2006 | 2007 | 2005 | 2006 | 2007 |
| $GPP_{3-PGday}$ | 1,201 | 1,158 | 953 | 1,660 | 1,399 | 1,634 |
| GPP_{EC} | 1,155 | 1,178 | 942 | 1,635 | 1,409 | 1,574 |
| $NEE_{3-PGday}$ | -271 | -256 | -30 | -589 | -293 | -486 |
| NEE_{EC} | -237 | -249 | -90 | -603 | -496 | -417 |
| $R_{eco3-PGday}$ | 894 | 613 | 984 | 1,074 | 1,137 | 1,154 |
| R_{ecoEC} | 888 | 621 | 854 | 1,033 | 914 | 1,157 |

Negative NEE values indicate carbon uptake from the atmosphere (i.e. the system acts as a CO₂ sink)

4 Discussion

Trends toward higher temperatures and reduced precipitation are predicted to produce unfavourable soil water balance conditions in Mediterranean region causing intense drought stress (Williams et al. 2013), the decline of forest trees, and possible transition of forest ecosystems to shrubland-type or stepic vegetation.

This might come as the result of the crucial role of soil water availability in constraining plant gas exchange and carbon uptake. For this reason, a viable representation of soil water content variability over drought onset and progression is considered an

important prerequisite for modelling forest primary productivity and carbon balance under Mediterranean conditions.

The previous 3-PG model version, similar to the 3-PGS version presented by Nolè et al. (2009), showed an overestimate of gross primary productivity (GPP) during summer months in Mediterranean sites with low precipitation, consistent with results reported by Law et al. (2000). The discrepancies were likely associated with an overly simplified representation of soil water availability, and consequent inaccurate effects on physiological processes.

In our attempts to upgrade the original 3-PG model structure from a monthly to daily time step, we implemented a routine to better represent soil water availability. Feikema et al. (2010) successfully introduced a rather complex multi-layer soil water balance into 3-PG to simulate forest plantation transpiration in southeastern Australia. We similarly assumed the effect of progressive drought on plant physiology could be conveniently obtained by water balance-driven temporal development of soil water availability; however, our application was simpler and less demanding, and was parameterized as a single-layer bucket representation of soil water availability.

We followed the direction of Duursma et al. (2008), which showed daily plant gas exchange during drought could be reasonably predicted by a simple model restricted to the soil compartment. This is in agreement with the indication by Piedallu et al. (2013) that showed soil water balance performed better than climatic variables for modelling plant ecological parameters under Mediterranean conditions. Feikema et al. (2010) showed that the improved 3PG+model simulated daily

Fig. 6 Eight-day aggregated Bias (see Eq. 24) for GPP as a function of air temperature (T_{air}), relative soil water content (RWC_{soil}), and fraction of absorbed photosynthetic active radiation (f_{PAR}) for the two study sites

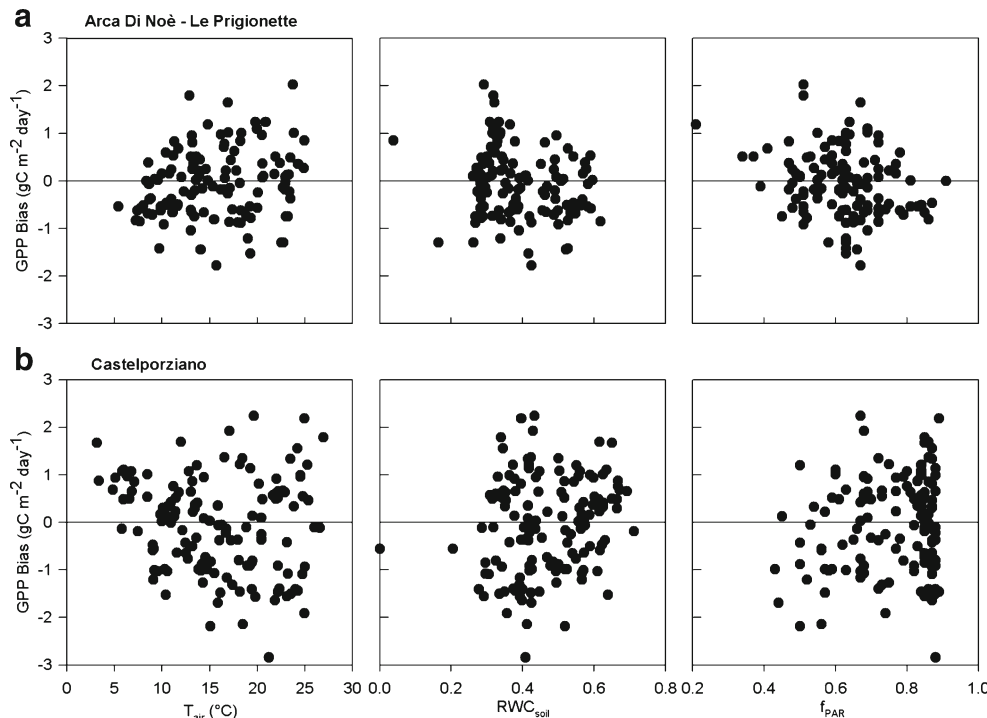
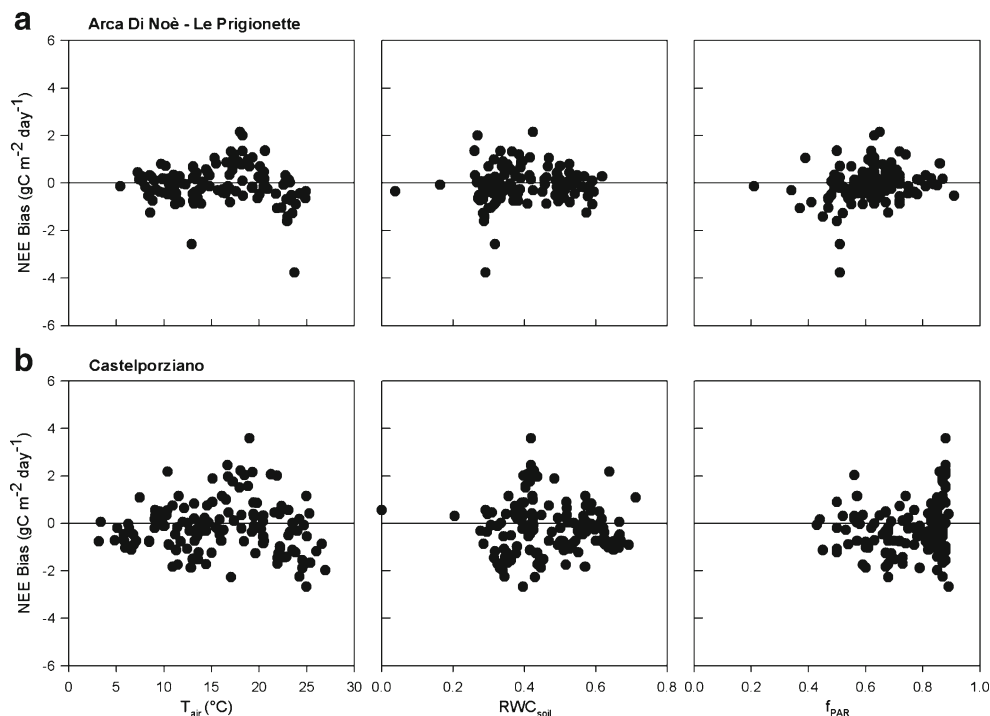


Fig. 7 Eight-day aggregated Bias (see Eq. 24) for NEE as a function of air temperature (T_{air}), relative soil water content (RWC_{soil}), and fraction of absorbed photosynthetic active radiation (f_{PAR}) for the two study sites



stand transpiration in reasonable agreement with observed values; however, they did not extend their analysis to stand-level carbon flux comparisons.

Our new model version satisfactorily captured seasonal patterns of both gross primary production (GPP) and net ecosystem exchange (NEE), with better prediction of GPP than NEE. The model explained daily GPP and NEE variability at

both study sites, and this resulted in reliable GPP and NEE predictions on an annual basis (Table 3). During drought, the model's capacity to identify environmental conditions that change the forest from a carbon sink to a carbon source was of particular importance to ecosystem carbon balance estimates. Forest carbon uptake can be heavily affected by heat waves and rainfall deficits (e.g. Ciais et al. 2005), and even

Fig. 8 Eight-day aggregated Bias (see Eq. 24) for R_{eco} as a function of soil temperature (T_{soil}), relative soil water content (RWC_{soil}), and fraction of absorbed photosynthetic active radiation (f_{PAR}) for the two study sites

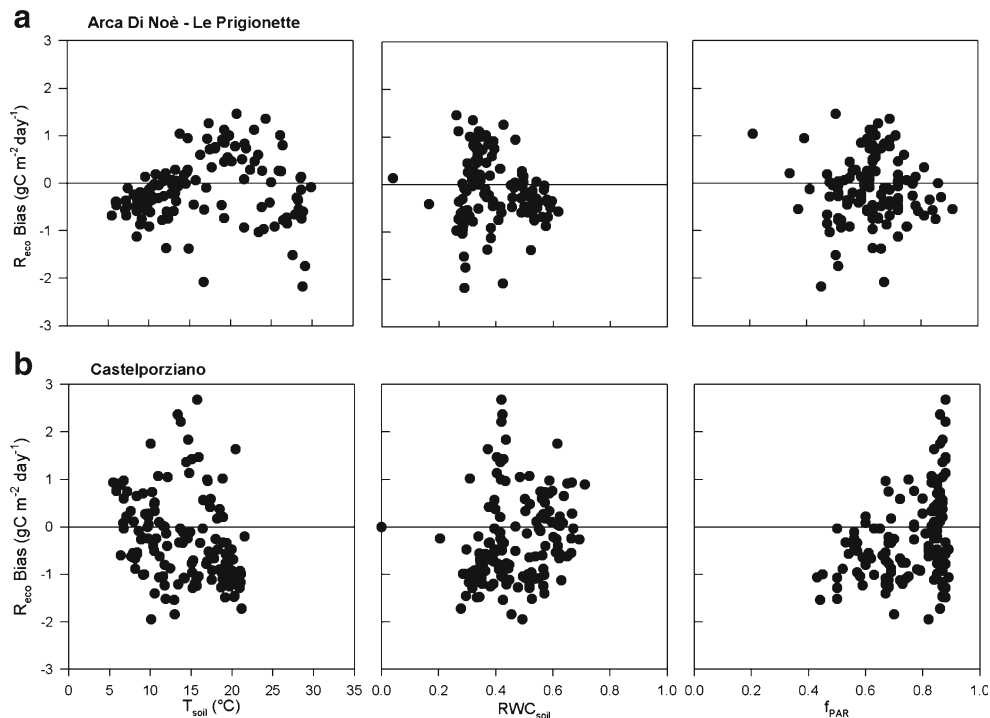
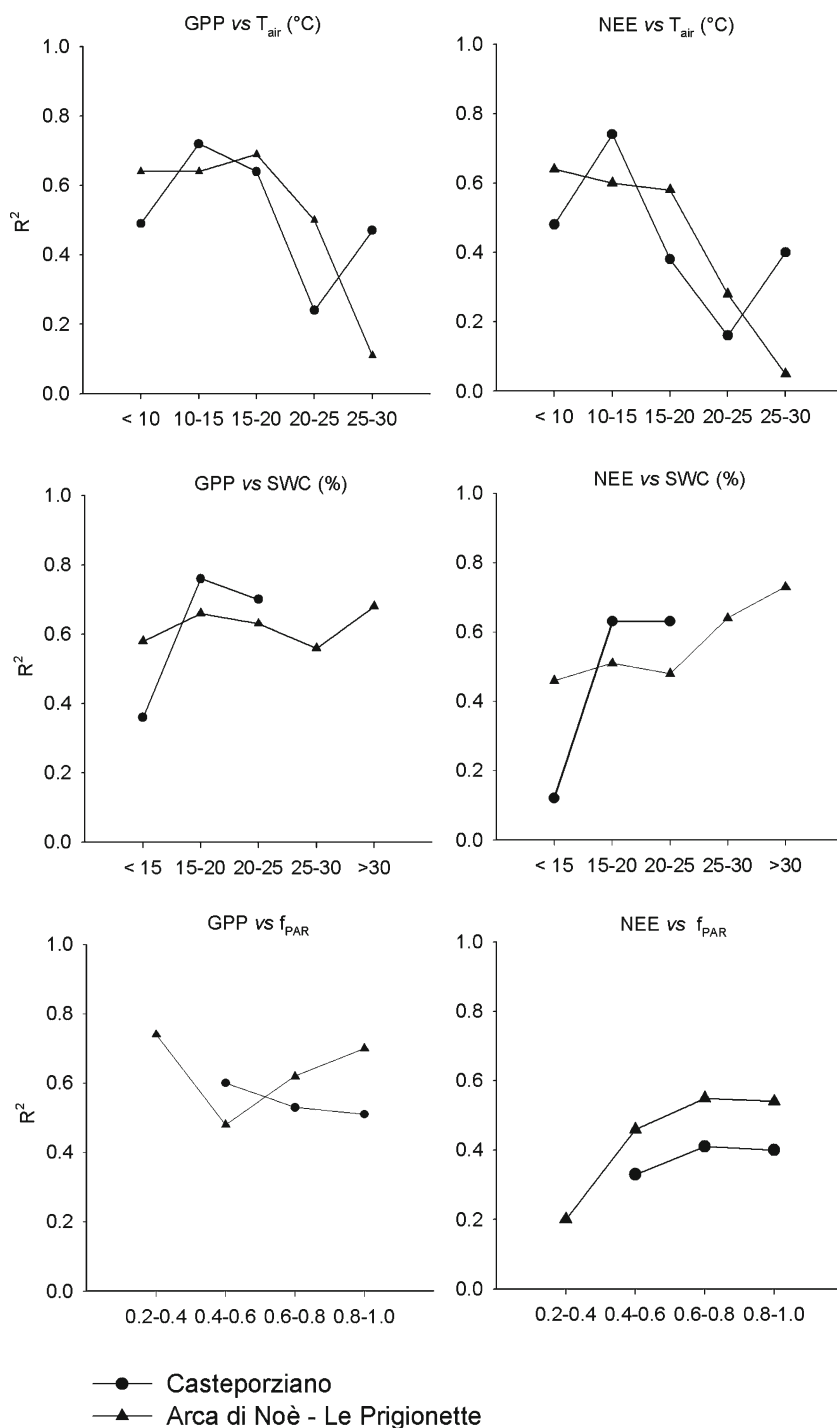


Fig. 9 R^2 estimator variation (see Eq. 25) as a function of air temperature (T_{air}), relative soil water content (RWC_{soil}), and fraction of absorbed photosynthetic active radiation (f_{PAR}) for GPP and NEE at the two study sites



short-term fluctuations in soil humidity, following dry soil rewetting by occasional precipitation might significantly affect forest ecosystem net carbon gain (Jarvis et al. 2007). Such conditions are predicted to become more frequent under future climatic conditions in the Mediterranean region (IPCC 2007), with accumulated effects potentially leading to drought-induced forest decline (Anderegg et al. 2012).

Net ecosystem carbon exchange (NEE) was predicted by introducing an empirical soil respiration model in 3-PG_{day} in

which the relative soil water content, expressed as a fraction of water content at field capacity, was the crucial soil respiration (R_{soil}) predictor on a daily basis (Reichstein et al. 2003; Tedeschi et al. 2006). However, to calculate ecosystem respiration (R_{eco}) 3-PG_{day} retained the original assumption that autotrophic respiration (R_a) was a constant fraction of soil heterotrophic respiration and GPP. This may explain why the model did not generate a faithful representation of short-term fluctuations in ecosystem respiration (Fig. 5).

Nonetheless, 3-PG_{day} successfully captured environmental conditions at Arca di Noè-Le Prigionette, when results showed that changed into a carbon source (Fig. 4). In addition, on a seasonal scale NEE model estimates were satisfactory (Table 3), which confirms the assumption that separating soil autotrophic and heterotrophic respiration does not impair the model's predictive power to long-term projections (Nolè et al. 2009).

The analysis of model Bias (Figs. 6, 7, and 8) showed that divergence between modelled and measured values was not influenced by the effects of any single environmental variable; however, correlation strength between modelled and measured values as a function of environmental variables did indicate model predictions were weaker with increasing air temperature and decreasing relative soil water content (Fig. 9). This requires careful model applications under the extreme conditions forecasted by climate projections. In particular, model sensitivity to soil humidity was interpreted as an expected consequence of the new model structure, and marked a difference with the previous model version, which was more sensitive to lower rates of atmospheric humidity rather than precipitation and soil humidity (Nolè et al. 2009). It is noteworthy that a better model performance in the simulation of soil humidity was observed for the clay-soil Arca di Noè Le Prigionette site (Fig. 2), and this could explain differences in model performance for low soil water conditions at the two sites (Fig. 9). Therefore, further improvements might be obtained with enhanced model parameterization, particularly for air temperature and soil humidity responses and especially for sandy soils. However, the semi-empirical nature and simplicity inherent in the original model formulation (Landsberg and Waring 1997) appears itself as an obstacle allowing the model to effectively predict short-term daily variations.

Overall, the modified 3-PG model, that retains sufficient simplicity in comparison with more demanding models (e.g. Chiesi et al. 2012), can be considered as a reliable tool to provide quantitative information on the potential for carbon uptake and carbon accumulation in Mediterranean drought-prone forest ecosystems and as an aid to design conservation and management strategies in order to mitigate the likely impacts of climate change on forest ecosystems dynamics.

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