

# Impact of precipitation, air temperature and abiotic emissions on gross primary production in Mediterranean ecosystems in Europe

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## Abstract

Mediterranean ecosystems are significant carbon sinks and are particularly sensitive to climate change. However, the carbon dynamics in such ecosystems are still not fully understood. An improved understanding of the drivers of carbon fixation by vegetation is needed to better predict how these ecosystems will respond to climate change. In this study, a large dataset collected through the FLUXNET network is used to estimate how the gross primary production (GPP) of different Mediterranean ecosystems was affected by air temperature and precipitation between 1996 and 2013. We showed that annual precipitation and temperature were not significant drivers of annual GPP. However, inter-annual variations of GPP seemed largely controlled by the precipitation during early spring (March–April). Late spring and early summer temperature also had a positive effect on annual GPP. We furthermore show that GPP may also have been influenced by both summer rainfall pulses and abiotic emissions due to carbonates precipitation/dissolution. Finally, the sensitivity of GPP in the Mediterranean region to climate drivers seemed not to be ecosystem-type dependent. Our results can provide general information for modeling exercises and improve future biomass projections on a regional scale.

**Keywords** Growth primary production · Mediterranean ecosystems · FLUXNET · Climate

## Introduction

Mediterranean land ecosystems are of particular interest for ecological research because their outstanding biodiversity is one of the most diverse after that of the tropical regions

(Cowling et al. 1996). This remarkable diversity is due to a combination of biogeographical and environmental factors (e.g., soil types, precipitation and temperature), but also to human activities that have been present for millennia (Lavorel et al. 1998; Rey Benayas and Scheiner 2002). It has been hypothesized that these ecosystems could be severely affected by global climate change in the future. This includes the modification of temperature and precipitation regimes, with possibly longer periods of drought, heavier rainfall events and increased summer temperatures (Giorgi and

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Lionello 2008; Hertig and Jacobeit 2008; Polade et al. 2014; Dubrovsky et al. 2014). CO<sub>2</sub> increase may also become an important driver of species distribution within these regions (Keenan et al. 2011). Mediterranean ecosystems supply numerous ecosystem services to people such as water cleaning and flood protection and are also acting as carbon sinks, with a carbon uptake that is slightly lower than other European forest types (Janssens et al. 2003). For instance, Vayreda et al. (2012) and Pereira et al. (2007) observed a mean net ecosystem exchange (NEE) of 1.4 Mg C ha<sup>-1</sup> yr<sup>-1</sup> in a Spanish and Portuguese forest and of 1.9 Mg C ha<sup>-1</sup> yr<sup>-1</sup> for a grassland in Portugal, while an average NEE of 2.7 Mg C ha<sup>-1</sup> yr<sup>-1</sup> was found for forest ecosystems from the EURO-FLUX network throughout Europe (Janssens et al. 2003).

Over the last decade, considerable effort has been made to investigate the effect of precipitation and air temperature on biomass production on several different ecosystems (Valladares et al. 2008; Goerner et al. 2009). So far, however, most of this research was carried out using single site experiments (e.g., rain exclusion—Limousin et al. 2009, 2010; Martin-StPaul et al. 2013) or using only a few sites with a single ecosystem type (Reichstein et al. 2002). Consequently, contrasting results are reported in the literature. For instance, Reichstein et al. (2002) observed a high sensitivity to drought for three Mediterranean evergreen forests (two dominated by *Quercus ilex* L. and one by *Juniperus phoenicea* L.) whereas Grünzweig et al. (2008) reported that another Mediterranean species (*Quercus calliprinos* Webb) was not affected by drought. Sabaté et al. (2002) pointed out that Mediterranean oak forests (*Quercus ilex*) were particularly sensitive to summer drought, whereas Allard et al. (2008) observed an absence of response to summer drought for another Mediterranean oak forest also composed by *Quercus ilex*. Moreover, Maselli (2004) suggested that spring precipitation is the most important factor controlling inter-annual variations of vegetation stress. These results highlight the importance of taking the distribution of precipitation within a year into account, rather than the annual sum. Our results also underline the species-specific response to climate drivers. This response to climate drivers therefore results in an ecosystem response that depends on the floristic composition (Baldocchi et al. 2004, 2010; Forner et al. 2018).

To allow broader conclusions, satellite monitoring of normalized difference vegetation index (NDVI) has been used (Maselli et al. 2014). However, the link between a vegetation index and gross primary production (GPP) is not straightforward and there is a substantial spread between different satellite products (Garrigues et al. 2008). Moreover, satellite data generally do not provide long-term information with high temporal resolution like site studies do. Thus, to allow broader conclusions over the Mediterranean region, studies with a long temporal scale and a large spatial distribution

are needed. Furthermore, the effect of annual or seasonal precipitation on primary production is generally addressed, but without taking extreme events into account that may substantially impact primary production, particularly in Mediterranean ecosystems (Zhang et al. 2013). Finally, carbonate soils are common in parts of the Mediterranean area (Dürr et al. 2005) and may influence GPP measurements through abiotic emissions (e.g., Hao et al. 2013), but are not often accounted for (e.g., Schulze et al. 2009). Abiotic emissions are the results of the carbonates formation and dissolution which may fix or emit CO<sub>2</sub>, and omitting such fluxes may lead to errors in GPP estimation (Serrano-Ortiz et al. 2009). Another source of error for GPP is the emission of biogenic volatile organic compounds (BVOCs) that may represent a significant fraction of the GPP (Seco et al. 2017) and is generally ignored in the GPP estimation (Papale et al. 2006).

Thus, the understanding of climate drivers of GPP in Mediterranean ecosystems is still suffering from caveats because, up to now, it has been based only on a few sites or on satellite data. To our knowledge, no other study has investigated the impact of annual and seasonal precipitation and air temperature on the primary production of Mediterranean ecosystems using a large collection of sites under different climatic conditions and covering different vegetation types, furthermore taking abiotic emissions and dry season rainfall pulses into account. Model projections yet indicate that the Mediterranean region will be strongly affected by future climate change (Giorgi and Lionello 2008; Polade et al. 2014; Guiot and Cramer 2016). This makes the Mediterranean region one of the most vulnerable regions to climate change worldwide (Nissen et al. 2014). In this context, understanding the response of Mediterranean ecosystems to changes in temperature and precipitation is of a major importance and it is essential to provide information for modeling exercises to improve future biomass projections on a regional scale. The main goal of this study is to identify the impact of annual and seasonal precipitation (PPT) and air temperature (T) on GPP throughout the European Mediterranean region, based on a multi-sites analysis and considering abiotic emissions effect on GPP estimation.

## Materials and methods

### Dataset and site selection

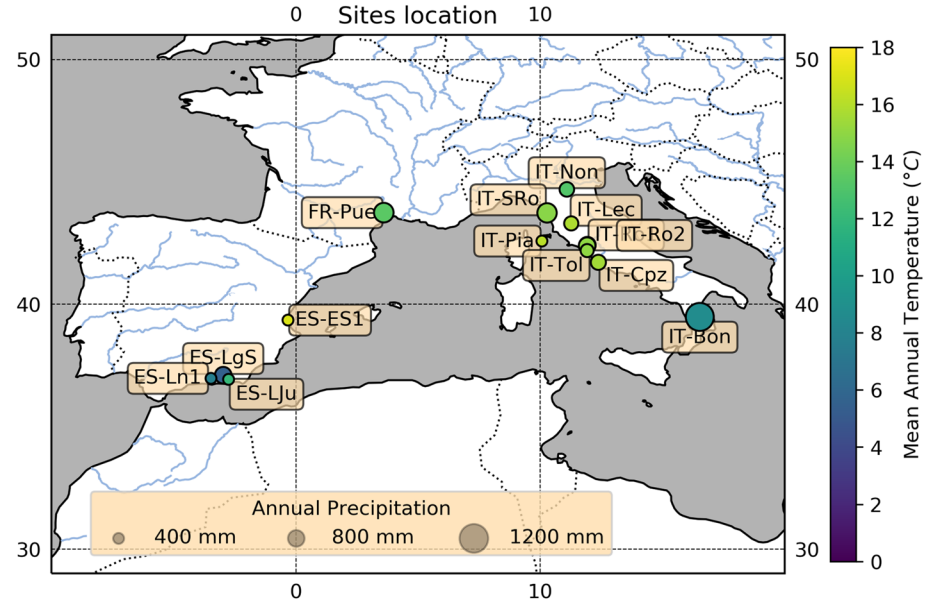
We used the FLUXNET database (<http://www.fluxdata.org>), which contains flux measurements (CO<sub>2</sub>, water, etc.) based on the eddy covariance method (Baldocchi et al. 2001) and meteorological measurements at a high temporal resolution (up to 30-min intervals) for a time period which is site dependent (from few years to few decades). The database covers more than 500 registered sites worldwide and

is partly freely available under a fair-use policy. All data provided by the international FLUXNET network are processed according to standardized formats and data processing protocols (Reichstein et al. 2005; Papale et al. 2006; Moffat et al. 2007).

In this study, we used level 4 data (L4, 30 min time steps) of GPP, NEE, PPT, T, latent heat flux (LE), sensible heat flux (H) and soil water content (SWC) and level 3 data (L3, 30 min time steps) of wind speed (WS) from the La Thuile collection (see also <https://fluxnet.fluxdata.org/data/la-thuille-dataset/>). Level 3&4 share the same data collection protocol but group different variables. We selected sites that are located within the Mediterranean region with the following vegetation types: shrubs (S), deciduous broadleaf trees (DBT), evergreen needle leaf trees (ENT) and evergreen broadleaf trees (EBT). To increase statistical power, we did not consider the details floristic composition as an explaining factor but we grouped the site using the four vegetation types described previously. Nevertheless, dominant species are provided in the supplementary material (Table S2). We

only focused on the European region (Table S1, Fig. 1). From the site-year files, we calculated the annual mean and sum of GPP, PPT and T for each site and for each year. We also included the corresponding vegetation types in our analysis. To be able to investigate the impact of the sub-annual variability, we split the year into six parts using a bimonthly time step [January & February (JF), March & April (MA), May & June (MJ), July & August (JA), September & October (SO), November & December (ND)] (cf. Table 1 subset S0–S6). We only considered the site-year files where at least 90% of the data per year or bimonthly time step were available. We choose a bimonthly time step to be as integrative as possible over a season. Choosing a seasonal time step would have induced a large reduction of the dataset, and it would have been difficult to reach the 90% threshold fixed above. Furthermore, we only took sites that had no heavy management practices or major disturbances during the years of study (Table S2) into consideration. This selection process resulted in 15 sites in three different countries (France, Italy and Spain) as presented in Table S1 and in Fig. 1. The total

**Fig. 1** Map of the distribution of sites used in the current study



**Table 1** Annual and bimonthly subsets

ID	Subset description	
S0	mean annual (Jan.-Dec.) PPT and T	<div></div> <div>(A) Impact on average annual GPP</div> <div>(B) Impact on total annual GPP (sum)</div> <div>(C) Impact on average seasonal GPP</div>
S1	mean JF (Jan. & Feb.) PPT and T	
S2	mean MA (Mar. & Apr.) PPT and T	
S3	mean MJ (May & Jun.) PPT and T	
S4	mean JA (Jul. & Aug.) PPT and T	
S5	mean SO (Sept. & Oct.) PPT and T	
S6	mean ND (Nov. & Dec.) PPT and T	

PPT, precipitation; T, air temperature  
 Note that for the early winter (ND) subset we studied the impact of the PPT and T on the average annual GPP of the subsequent year rather than on the actual year

number of sites and site years can be found in Table 2 (1. No filter), rows 4 and 5, respectively.

## Data filters

Two data filters were applied to all the sites before carrying out the statistical analysis to try to isolate the effect of meteorological variables on GPP and avoid the impact of other abiotic processes that could possibly affect our results. GPP is not directly measured but estimated from net ecosystem exchange (NEE) and total ecosystem respiration measured overnight. NEE can be partially driven by abiotic processes inducing a bias in GPP estimations. Therefore, data filtering is generally recommended (Serrano-Ortiz et al. 2009). The first filter concerns abiotic emissions (Serrano-Ortiz et al. 2009; Sanchez-Cañete et al. 2011), and the second deals with rain events (e.g., Schwinning and Sala 2004). It is important to note that such filters are used to exclude days with environmental conditions favorable to abiotic emissions but cannot be used to directly estimate those abiotic fluxes.

Abiotic emissions can occur in certain ecosystems on carbonate soils and may influence NEE substantially (e.g., Kowalski et al. 2008). These soils can store in macropores large amounts of carbon that can be released to the atmosphere by subterranean ventilation during dry weather conditions that mostly occur during the summer season (Kowalski et al. 2008). The data filter is based on the research of Serrano-Ortiz et al. (2009) and Sánchez-Cañete et al. (2016). The first step separates ‘abiotic’ from ‘biological’ periods, as defined by Serrano-Ortiz et al. (2009) and filters out the abiotic days from the data. Serrano-Ortiz et al. (2009) describe abiotic periods during the dry season with a soil water content (SWC) below 15% and a mean daytime Bowen ratio higher than 4. Biological periods have a mean daily Bowen ratio smaller than 4 and a daily average air temperature higher than 4 °C (Serrano-Ortiz et al. 2007, 2009). The second step involves wind speed and filters out ‘windy’ days, as defined by Sánchez-Cañete et al. (2016), with a wind speed higher than 0.5 m s<sup>-1</sup>. They found that large amounts of carbon dioxide from below-ground storage were emitted to the atmosphere especially on windy days. This summarizes the first filter as:

1.1 Daily mean of ‘H/LE’ > 4; AND

Daily mean of ‘SWC’ < 15%; AND

1.2 Daily mean WS > 0.5 m s<sup>-1</sup>

These days are left out of our analyses as the response of GPP (annual or bimonthly) may be mostly due to abiotic processes rather than being a biological response of the ecosystem. Please refer to Table 2 (2. Rainfall filter) for the number of sites and site years left after the application of this filter (rows 4 and 5, respectively).

The second filter concerns rainfall pulses during the summer season. These pulses have the ability to release large amounts of carbon from the soil (e.g., Unger et al. 2010; Hao et al. 2013; López-Ballesteros et al. 2015) and may therefore cause a miss-representation in the estimations of the GPP. To define the threshold value, we made a frequency distribution of the daily precipitation values from May to October (Schwinning and Sala 2004). We set this daily threshold value at 5 mm day<sup>-1</sup>, which occurs at 50% of the days (Table S3). This summarizes as follows:

2. Daily mean precipitation > 5 mm

These days were excluded from our analyses for the same reason as the abiotic periods, i.e., the response in GPP may be caused by other processes than photosynthesis. The total number of sites and site years left after applying this filter can be found in Table 2 (3. Abiotic emissions filter), rows 4 and 5 respectively. We also tested the sensitivity of the daily precipitation threshold values of 75% (13 mm), 90% (25 mm) and 95% (37 mm), excluding only the 25%, 10% and 5% days with the largest rainfall pulses, respectively.

We performed the analyses with and without both filters to study the impact of subterranean ventilation and rainfall pulses during the summer in addition to the effect of temperature and precipitation on GPP.

## Statistical methods

The statistical analyses were performed with RStudio (version 0.99.473, 2009–2015 RStudio). We first performed principal component analysis (PCA) to explore the dataset. Then, the impact of annual and seasonal PPT and T on annual and seasonal GPP was tested using nested ANOVA, with annual or seasonal GPP as variable to be explained and annual and seasonal PPT and T as explaining variables. Each variable was calculated per site and per year. The sites and vegetation types were nested, which enabled us to take potential site- and vegetation-dependency effects into account. Because of non-normality that was not solved with classical transformation, data were rank-transformed before the analyses. This approach allowed us to use powerful parametric tools when application conditions are not respected (Conover and Iman 1981). This has already successfully been done in previous biogeochemistry studies (e.g., Guenet et al. 2014).

We tested seven different subsets (Table 1, S0–S6). We first investigated if the annual mean PPT and T significantly affected the annual mean GPP (Table 1, S0, case A). Then, we analyzed the annual GPP using the bimonthly mean, calculated per site and per year over the corresponding period, instead of annual mean PPT and T values (Table 1, S1–S6, case A). Note that we investigated the impact of PPT and

**Table 2** Results of the statistical analysis using vegetation and site as random factors

	Seasonal (S1–S6)						
	Annual (S0)	Jan & Feb (S2)	Mar & Apr (S3)	May & Jun (S4)	Jul & Aug (S5)	Sep & Oct (S6)	Nov & Dec (S1)
<b>1. No filter</b>							
Nr. of sites	<b>14</b>	<b>15</b>	<b>15</b>	<b>15</b>	<b>15</b>	<b>15</b>	<b>11</b>
Nr. of years	<b>64</b>	<b>61</b>	<b>71</b>	<b>69</b>	<b>73</b>	<b>71</b>	<b>52</b>
$R^2$			<b>0.75</b>	<b>0.88</b>	<b>0.85</b>		
Averages							
PPT	o	o	<b>0.0016 (<math>p &lt; 0.05</math>)</b>	o	o	o	o
T	o	o	o	<b>0.0099 (<math>p &lt; 0.025</math>)</b>	<i>0.0252 (<math>p &lt; 0.017</math>)</i>	o	o
PPT:T	o	o	o	o	o	o	o
$R^2$			<b>0.75</b>	<b>0.88</b>	<b>0.85</b>		
Sums							
PPT	o	o	<b>0.0016 (<math>p &lt; 0.05</math>)</b>	o	o	o	o
T	o	o	o	<b>0.0099 (<math>p &lt; 0.025</math>)</b>	<i>0.0252 (<math>p &lt; 0.017</math>)</i>	o	o
PPT:T	o	o	o	o	o	o	o
$R^2$	–				<b>0.78</b>		
Seasonal							
PPT	–	o	o	o	<b>0.0058 (<math>p &lt; 0.05</math>)</b>	o	o
T	–	o	o	o	<b>0.0205 (<math>p &lt; 0.05</math>)</b>	o	o
PPT:T	–	o	o	o	<b>0.0279 (<math>p &lt; 0.05</math>)</b>	o	o
<b>2. Rainfall filter</b>							
Nr. of sites	<b>14</b>	<b>15</b>	<b>15</b>	<b>15</b>	<b>14</b>	<b>14</b>	<b>11</b>
Nr. of years	<b>45</b>	<b>49</b>	<b>54</b>	<b>53</b>	<b>54</b>	<b>53</b>	<b>40</b>
$R^2$			<b>0.80</b>	<b>0.90</b>			
Averages							
PPT	o	o	<b>0.0207 (<math>p &lt; 0.025</math>)</b>	o	o	o	o
T	o	o	o	<b>0.0088 (<math>p &lt; 0.05</math>)</b>	o	o	o
PPT:T	o	o	o	o	o	o	o
$R^2$			<b>0.80</b>	<b>0.90</b>			
Sums							
PPT	o	o	<b>0.0207 (<math>p &lt; 0.025</math>)</b>	o	o	o	o
T	o	o	o	<b>0.0088 (<math>p &lt; 0.05</math>)</b>	o	o	o
PPT:T	o	o	o	o	o	o	o
$R^2$					<b>0.81</b>		
Seasonal							
PPT	–	–	–	–	<b>0.0471 (<math>p &lt; 0.05</math>)</b>	o	–
T	–	–	–	–	o	o	–
PPT:T	–	–	–	–	o	o	–
<b>3. Abiotic emission filter</b>							
Nr. of sites	<b>13</b>	<b>14</b>	<b>14</b>	<b>14</b>	<b>13</b>	<b>13</b>	<b>10</b>
Nr. of years	<b>50</b>	<b>52</b>	<b>60</b>	<b>58</b>	<b>61</b>	<b>60</b>	<b>42</b>
$R^2$			<b>0.67</b>	<b>0.87</b>	<b>0.83</b>		
Averages							
PPT	o	o	<i>0.0298 (<math>p &lt; 0.025</math>)</i>	o	o	o	o
T	o	o	o	<i>0.0309 (<math>p &lt; 0.017</math>)</i>	<b>0.0269 (<math>p &lt; 0.05</math>)</b>	o	o
PPT:T	o	o	o	o	o	o	o
$R^2$			<b>0.67</b>	<b>0.87</b>	<b>0.83</b>		
Sums							
PPT	o	o	<i>0.0298 (<math>p &lt; 0.025</math>)</i>	o	o	o	o

**Table 2** (continued)

		Seasonal (S1–S6)						Nov & Dec (S1)
		Annual (S0)	Jan & Feb (S2)	Mar & Apr (S3)	May & Jun (S4)	Jul & Aug (S5)	Sep & Oct (S6)	
T	o	o	o		<i>0.0309</i> ( $p < 0.017$ )	<b>0.0269</b> ( $p < 0.05$ )	o	o
PPT:T	o	o	o		o	o	o	o
$R^2$						<b>0.77</b>		
Seasonal								
PPT	–	–	–	–		<b>0.0350</b> ( $p < 0.05$ )	o	–
T	–	–	–	–		o	o	–
PPT:T	–	–	–	–		o	o	–

We performed three cases: In the first case, no filter was applied (1), in the second case the rainfall filter (2), in the third case the abiotic emission filter (3). Numbers represent significant  $p$  values ( $p < 0.05$ ) whereas an ‘o’ represents no significance ( $p > 0.05$ ). The used significance levels are given in brackets. The  $R^2$  of the model is only reported when at least one variable was significant. Bold emphasis is representing  $p$  values that are still significant after the Holm–Bonferroni correction. Italic emphasis indicates the  $p$  values that lost their significance after the Holm–Bonferroni correction. Bold italic emphasis represents the applied significance level without using the Holm–Bonferroni correction (seasonal approach)

T on the average annual GPP of the subsequent year rather than on the current year for the ND subset, because at this time of the year the current climatic factors hardly control the total growing strength of the current year (Table 1). In a next step, all tests were repeated using the total annual and bimonthly sum, instead of mean values for GPP and PPT (Table 1, S0–S6, case B). All the variables were calculated per site and per year. In the bimonthly case, only the data from the corresponding period were considered for the calculation of the mean value. As we applied several hypotheses on one single dataset, we faced the problem of multiple comparisons minimizing the probability of receiving a Type I error (i.e., the rejection of a true null hypothesis). Accordingly, we corrected the original significance level ( $p = 0.05$ ) by applying the Holm–Bonferroni method (Holm 1979). In a last step, we investigated if the PPT and T of specific seasons (bimonthly time periods, both the sum and the average) significantly affected the GPP of the corresponding seasons (Table 1, S1–S6, case C). In the latter case, applying the Holm–Bonferroni method was not necessary as we used an independent dataset for every season and subset.

To interactively explore which predictors provided a good fit, we applied a stepwise regression in all cases, which conducts an automatic stepwise model selection by the (AIC) Akaike information criterion.

## Results

### Inter-annual GPP variability

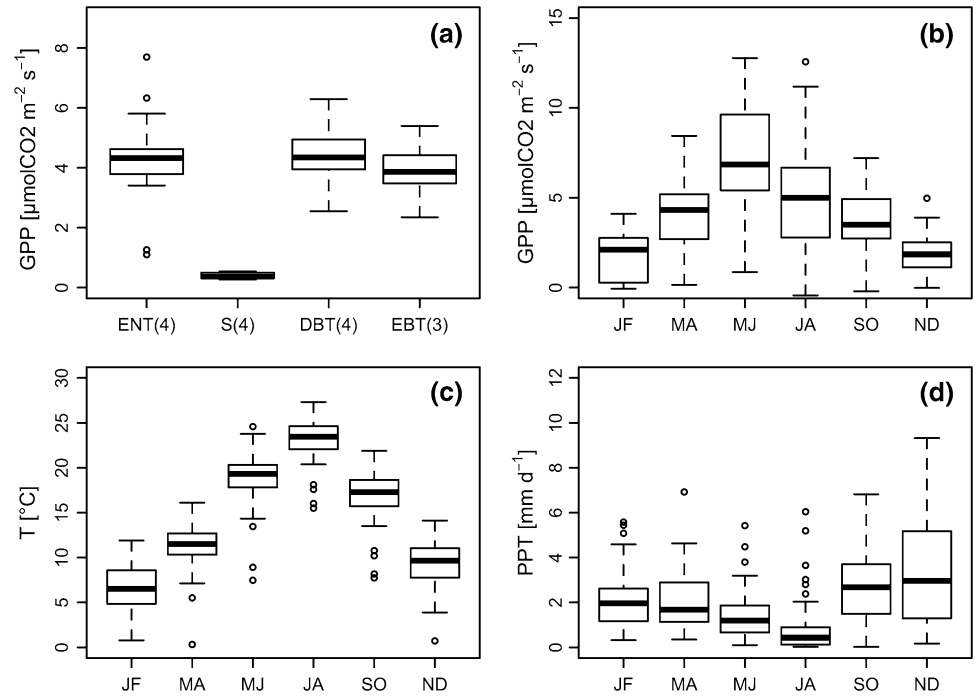
Over the selected sites, the vegetation faces a typical Mediterranean climate, with usually hot and dry summers as well

as mostly mild and moist winters (Fig. 2c–d). Temperature ranged from  $-0.25$  (in January–February) to  $27.4$  °C (in July–August) (Fig. 2c, bimonthly averages) and the seasonal PPT from  $0.02$  (in July–August) to  $13.2$  mm d<sup>−1</sup> (in November–December) (Fig. 2d, bimonthly averages). For the different forest types (ENT, DBT, EBT), the GPP values were rather similar to each other (Fig. 2a). GPP values for shrubs were lowest and showed very little variability. One of the investigated shrub sites, Pianosa, was already found to be unproductive by Reichstein et al. (2007) (Fig. 2a).

The two first axes of the PCA using the annual GPP, T and PPT explained 75.2% of the data variance (Fig. 3a). Principal component one (Dim1), which explained 43.2% of the data variance, was positively correlated with GPP and T. Dim2 accounted for 32% of the data variability and was positively related with PPT and vegetation types. Nevertheless, with nested ANOVA, no significant correlation was found between annual GPP and annual T (for both mean and total) or annual PPT across sites and years (Table 2). Applying simple linear regression models also did not result in a clear relationship between annual and bimonthly PPT and annual GPP (Fig. 4a, b), or between annual and seasonal T and annual GPP (Fig. 4c, d). However, by using bimonthly averages or the sum (in case of PPT) as explaining variables in the more advanced nested ANOVA, annual GPP (average and sum) could be explained ( $p < 0.05$ ) by precipitation during early spring (MA) and air temperature during the early summer (MJ) (Table 2, Fig. 4a, c). Note that the regressions showed in Fig. 4 are only drawn when we found a significant interaction with the nested ANOVA (Table 2), and all the regressions are provided in supplementary materials. Furthermore, the  $R^2$  values in the figures relate to simple linear regression. This was mainly done to show the differences



**Fig. 2** Boxplots showing **a** the general GPP distribution of the different vegetation types (*ENT* evergreen needle trees, *DBT* deciduous broadleaf trees, *EBT* evergreen broadleaf trees, *S* shrubs, numbers in the brackets indicating the numbers of sites per vegetation type) and **b** the GPP distribution **c** the air temperatures (T) and **d** the precipitation distribution observed during the different bimonthly time periods (*JF* January & February, *MA* March & April, *MJ* May & June, *JA* July & August, *SO* September & October, *ND* November & December)



between the two methods. Finally, the interactions between the explaining variables, T (bimonthly & annual) and PPT (bimonthly and annual), did not significantly impact the annual average of GPP (Table 2).

### Intra-annual GPP variability

The bimonthly distribution showed a low GPP at the beginning of the year (JF) that increased till MJ (highest median value  $6.8 \text{ gC m}^{-2} \text{ d}^{-1}$ ) (Fig. 1b). During the summer (JA), GPP slowly decreased until the lowest median value in ND ( $2.2 \text{ gC m}^{-2} \text{ d}^{-1}$ ). The highest variability in GPP was observed in MJ and JA.

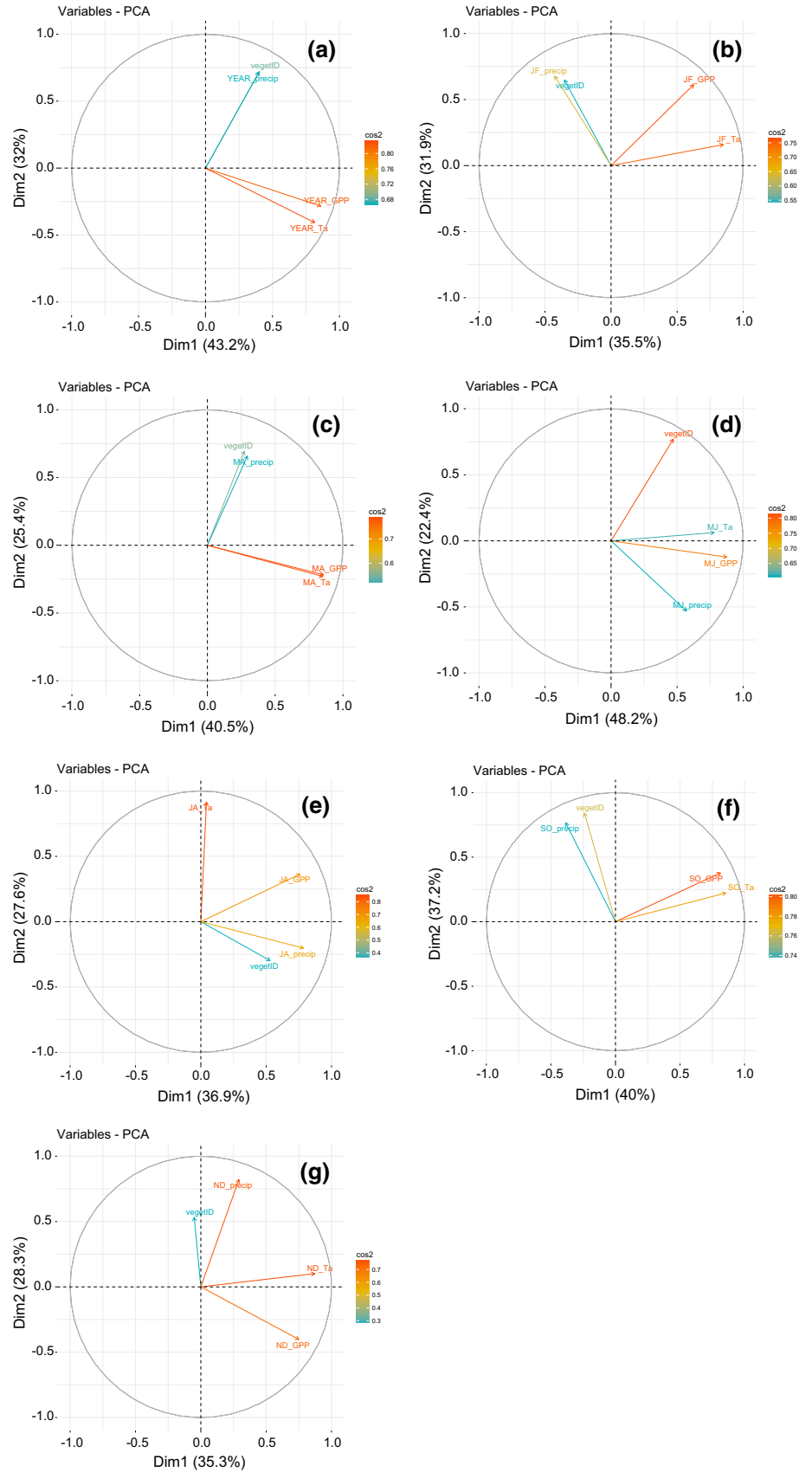
During the summer months (JA), PCA analysis showed that bimonthly average GPP was distributed over the two axes, whereas bimonthly average T and PPT were distributed over Dim2 and Dim1, respectively (Fig. 3e). Consistently, nested ANOVA showed that the bimonthly average T affected the bimonthly average GPP (Fig. 4d; Table 2; seasonal approach). In general, seasonal GPP was positively affected by seasonal T. In JA, the bimonthly average GPP was additionally affected by the bimonthly average of PPT (Fig. 4). Furthermore, there was an interaction between seasonal PPT and seasonal T during these months that was correlated to the bimonthly average of GPP (Table 2). Note that we also tried to perform the analysis at a monthly time step or using the previous time step of the observed climatology but no significant relationships were observed (data not shown).

### Rainfall pulses and abiotic emissions

When we excluded rainfall pulses (days with precipitation events larger than  $5 \text{ mm d}^{-1}$ —“Data filters” section) from July to October, JA temperatures did no longer impact the annual GPP (Table 2). However, when applying the rainfall pulses with a threshold to 75% (excluding rainfall pulses larger than  $13 \text{ mm d}^{-1}$ ) or larger (90% and 95%), the GPP is again sensitive to JA temperatures. Besides this, the results do not seem very sensitive to the threshold used to exclude days with rainfall pulses (Table S5). There was no change for MJ T and MA PPT. Due to the rainfall filter, there was one site less available for our analyses in both JA and SO. The number of suitable years decreased in all seasons, but there were still enough years to have confidence in the results (Table 2).

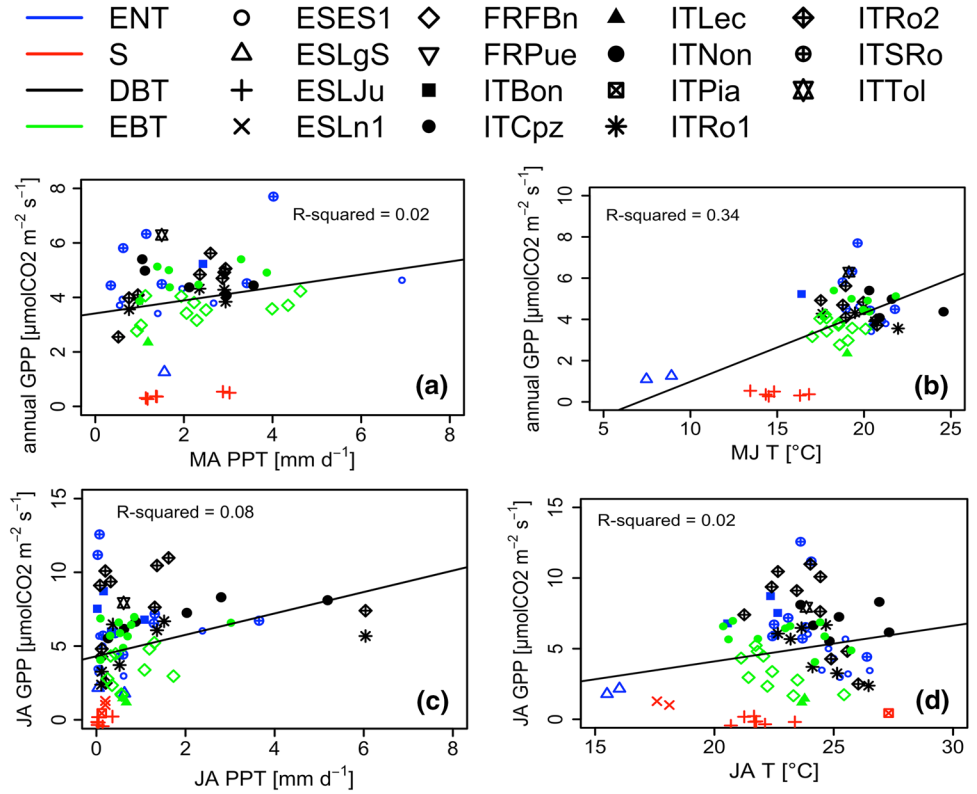
Excluding days with potential high abiotic emissions (“Data filters” section) did not change the influence of JA T on the GPP. However, the temperature in MJ no longer impacted annual GPP ( $p$  values  $< 0.05$  but not significant after applying the Holm–Bonferroni correction). The latter was also found for spring precipitation (MA), although the  $p$  values were very close to being significant after the correction method (Table 2). The number of available sites and years for our analysis decreased in all seasons. Also the correlation showed an overall decrease (Table 2).

**Fig. 3** Principal component analysis for annual variables (a), and for each bimonthly period (b–g)





**Fig. 4** Seasonal mean PPT versus the annual mean GPP (a), seasonal mean PPT versus the seasonal mean GPP (b), seasonal mean T versus the annual mean GPP (c) and seasonal mean T versus the seasonal mean GPP (d) for the different vegetation types and over the different bimonthly time periods. See Fig. 2 for the abbreviations of the vegetation types (ENT, DBT, EBT and S). The simple trend line and R-squared value were added where a significant  $p$  value was obtained during our statistical tests (see Table 2). Note that the  $R$ -squared value is obtained with a simple linear regression and does not correspond to the  $R$ -squared of Table 2. The nonsignificant relationships are given in supplementary material



## Discussion

### GPP versus NEE

In this study, we investigated the response of GPP to the different climatic drivers, precipitation and temperature, in the Mediterranean region using data based on the eddy-covariance method from the FLUXNET database (Baldocchi et al. 2001). The GPP is derived from NEE measurements, and assumptions on ecosystem respiration ( $R$ ) may not always reflect the primary production of the ecosystem if  $R$  is wrongly assessed (Reichstein et al. 2005). This may especially be an issue in Mediterranean ecosystems during drought conditions when GPP and  $R$  can be decoupled (e.g., Allard et al. 2008). Moreover, abiotic emissions can impact NEE measurements, as found at different Mediterranean sites (e.g., Serrano-Ortiz et al. 2007, 2009, 2010; Kowalski et al. 2008; Sanchez-Cañete et al. 2011, 2016; Pérez-Priego et al. 2013; López-Ballesteros et al. 2015), causing additional uncertainties in the GPP estimates. Furthermore, rain pulses during the dry season can cause uncertainties in GPP values as large amounts of  $\text{CO}_2$  may be released by soil respiration depending on ‘pulse size’ and ‘pulse duration’ (e.g., Knapp et al. 2002; Cable and Huxman 2004; Schwinning and Sala 2004; Rey et al. 2005; López-Ballesteros et al. 2015). The latter involves complex interactions on different levels in the trophic web and different growth responses of

vegetation as described in detail by Schwinning and Sala (2004). To account for these effects, we applied two different filters to the data, and we repeated all the analyses for both GPP and NEE. Nevertheless, as described in “Data filters” section, the filters that we used help to exclude days with potential abiotic fluxes, but cannot be used to estimate the abiotic fluxes. GPP estimated based on NEE may also be biased due to the implicit assumption that BVOC emissions are negligible whereas they may represent a non-negligible fraction of the GPP (Portillo-Estrada et al. 2018). Moreover, the BVOC fluxes are also controlled by climate drivers (Loreto and Fineschi 2015; Jiang et al. 2018). In this study, we ignored such contributions since the data were not available. Incorporating BVOCs may however be a necessary step in the future as some studies show that emissions of isoprene, which is globally the most emitted BVOC, may be impacted by climate change (Staudt et al. 2017; Genard-Zielinski et al. 2018).

### Spring precipitation

Interestingly, neither the annual T nor the annual PPT was found to have a major control on annual biomass production in the Mediterranean region. This underlines the importance of applying seasonal (or intra-annual) approaches rather than conducting mere inter-annual studies when investigating potential effects on biomass production within the

Mediterranean region. This finding is not in line with Jongen et al. (2011) who observed a positive correlation between annual precipitation and GPP for a Portuguese grassland, although of course this may also be due to the different vegetation type. Here, we did not investigate the precise floristic composition but divided the data into the four vegetation types, based on the dominant species of the sites, ignoring some species-specific response to climate drivers as previously observed (Baldocchi et al. 2004). Consequently, the absence of response here might result from a too large variance at ecosystems scales due to such species-specific response. At a global scale, Beer et al. (2010) also observed a positive relationship between GPP and mean annual precipitation. This effect was also found in China over different vegetation types (Yu et al. 2013). Our results suggest however that annual PPT may not be a major driver of GPP in the Mediterranean region. This is in accordance with Allard et al. (2008) who observed that the seasonal averages of precipitation, more than the annual average, were important drivers for GPP in a Mediterranean holm oak forest. Indeed, arid ecosystems seem less sensitive to annual PPT but more to its seasonality (Fay 2009; Robertson et al. 2009). Mediterranean vegetation is known to adapt its water use efficiencies to prevent drought (Forner et al. 2018). For instance, at leaf level, plants tend to modify their ratio between net CO<sub>2</sub> assimilation rate and stomatal conductance to increase the photosynthetic water use efficiency (Medrano et al. 2009). Consequently, those adaptive strategies may explain why Mediterranean vegetation is more sensitive to the seasonality of PPT than to its annual average. Since we used a site compilation, in opposite to what is generally done for Mediterranean region, where studies are usually performed only on one or few sites, our results can be considered as general trends over such type of ecosystems.

The rainfall during the early spring months (MA) had an important impact on annual GPP. PPT over the other time periods, however, did not significantly affect annual GPP (Table 2; Fig. 4). During MA, when the growing season starts, the rainfall (Fig. 2d) is high enough to support vegetation growth, whereas the air temperature is not yet too high to reduce carbon fixation (Fig. 2c). Hence, early spring does not only provide good growing conditions, and it can also control the soil moisture conditions before the extremely dry and hot summer months (see Fig. 2b, c). As the evaporative demand of the atmosphere is still relatively low in this period, most precipitated rainfall can be used for the recharge of aquifers. The highest GPP values as well as the highest GPP variability were observed in the late spring and summer months (MJ, JA; Fig. 2b). MA can thus be seen as a decisive time period in the year in controlling the annual biomass production which is consistent with Allard et al. (2008) who showed that a decrease of precipitation in April–June would have a large effect on annual net

ecosystem production (NEP), whereas the impact of decreasing precipitation in July–September on NEP would be less severe. A rainfall exclusion experiment in a *Quercus ilex* forest in the south of France confirmed these findings (Misson et al. 2010). Maselli (2004) also reported that vegetation activity was mainly affected by spring precipitation. Using NEE instead of GPP (Table S3) showed similar effects of PPT during MA. Because during these months the system is usually not yet water limited, GPP and R may not yet be uncoupled, resulting in better estimations of GPP obtained from NEE measurements.

## GPP during the summer season

### Temperature

Late spring and early summer T (MJ) seemed to significantly influence annual GPP (Table 2; Fig. 4c). Higher temperatures led to an increase in GPP. The soil moisture level at this stage of the summer may still have been sufficiently high to support the high temperatures and stimulate growth. Nevertheless, it is important to note that two sites (ESLJu and ESLgS), which are both located at high altitude in the Betic chain mountain, mainly drive this relationship over the 15 sites. Surprisingly, we found a slightly positive relationship between temperature and GPP during JA as well, although after applying the Holm–Bonferroni method the correlation was no longer significant (Table 2; Fig. 4c). Such a relationship was not expected as the Mediterranean region is characterized by a long growing season that is often interrupted during late summer, when water stress and temperatures are getting too high (e.g., Reichstein et al. 2002; Allard et al. 2008). Our results do not exactly support this finding, and Fig. 2b suggests that high GPP was also observed during JA. This is nevertheless coherent with Dong et al. (2019) who showed that the leaf carbon assimilation at the H. J. Andrews Experimental Forest (Oregon, USA) which faces a Mediterranean climate was relatively constant during summer.

Allard et al. (2008) suggested that under such extreme drought conditions, GPP and ecosystem respiration ( $R_{eco}$ ) are partly decoupled, most likely due to stomatal closure. However, as already mentioned, the results of GPP during the dry season may not perfectly reflect the biological activity. This is confirmed when using NEE instead of GPP in our analyses. In this case, the effect of temperature during summer is no longer significant (Suppl. Tab. 2), indicating that other processes are playing a role as well. Moreover, it is important to note that even though all the sites in our study are located within the Mediterranean region, some sites are located in mountainous regions (Table S1) and face different temperature regimes. Such differences may increase the variance of the data and therefore hide some site-specific patterns. Also rainfall pulses and abiotic emissions should

be considered when studying GPP in the summer season as discussed in the following paragraphs.

### Rain pulses

Birch (1958) already found that rewetting of a dry soil had a positive effect on mineralization. Orchard and Cook (1983) and (Van Gestel et al. 1993) also reported that remoistening of dry soils caused a peak in CO<sub>2</sub> efflux. They ascribed this effect to both assimilation of dead microbial biomass and an increase in microbial respiration directly after the rewetting took place. This has later been confirmed by many other studies (e.g., Emmerich 2003; Rey et al. 2005; Jarvis 2007; López-Ballesteros et al. 2015). More hypotheses on the cause of the sudden CO<sub>2</sub> efflux are discussed by Unger et al. (2010). Although all these studies found a strong response of CO<sub>2</sub> release to rainfall pulses, the magnitude of the pulse that triggered the response generally differed between studies (e.g., Schwinning and Sala 2004; Hao et al. 2013). Cable and Huxman (2004) tested for instance the difference between a 2 mm and a 25.4 mm rain pulse, while Unger et al. (2010) used a 20 mm irrigation pulse and Hao et al. (2013) used 3 mm and 5 mm at different times of the summer season. We used a daily frequency distribution of precipitation to choose different threshold values and decided on using 5, 13, 25 and 37 mm d<sup>-1</sup>. These are the values at which less than 50%, 75%, 90% and 95%, respectively, of all rainfall events occur (Table S3) and are comparable with the values found and used in other studies (e.g., Schwinning and Sala 2004; Hao et al. 2013). Excluding the 5 mm d<sup>-1</sup> rainfall events (50% of all events) from our data eliminated the effect of JA temperature on the annual GPP. However, excluding only the heavier precipitation events (13 mm d<sup>-1</sup>—75%; 25 mm d<sup>-1</sup>—90%, 37 mm d<sup>-1</sup>—95%) made GPP sensitive to JA temperatures again. This may depend partly on the number of days that are excluded (137, 47, 21 and 8 days for the 50%, 75%, 90% and 95%, respectively) bringing the number of days analyzed, when looking only at 75, 90 and 95%, closer to the original data when all rainfall events are included. In the original data, the JA T was influencing the GPP in JA as well. With the rainfall filters, this was no longer the case. It may suggest that during the days with rain, the clouds inhibited too much radiation, causing a decrease in photosynthesis. This is coherent with the observations of Moore et al. (2011) and Daly and McKee (2013) at HJ Andrews Experimental Forest (Oregon, USA). These results confirm the importance of including summer rainfall pulses in studies about drivers of GPP in the Mediterranean region. The effect of MA PPT on MA GPP and the effect of MJ T on MJ GPP did not change after the application of the rainfall filter. This may indicate that the soils still contain enough soil moisture to avoid the triggering of a CO<sub>2</sub> efflux. The rainfall variability may also act differently on different vegetation types and soils, as the

way the vegetation responds to remoistening depends on the availability of water to the roots. Different rooting depths and infiltration rates will affect this response, but this was not investigated in the current study (e.g., Schwinning and Sala 2004) because such data were not available in our dataset. Additionally, we excluded all days with rainfall pulses from our analyses and did not take the dryness of the soil into account. CO<sub>2</sub> releases mostly occur on dry soils, and by filtering all days with rainfall events, we may also have eliminated rainy days over wet soils that may not be prone to CO<sub>2</sub> release and may even stimulate GPP. Lastly, we excluded only single days from our data to avoid reducing our dataset too much. Abiotic CO<sub>2</sub> fluxes mainly occur when weather conditions favor abiotic processes, but it is important to note that some studies suggest that the CO<sub>2</sub> efflux can last up to several days after the rain pulse (e.g., Jarvis 2007; Hao et al. 2013; López-Ballesteros et al. 2017). However, López-Ballesteros et al. (2017) also find the largest R at the day of the rain pulse, as Rey et al. (2005). Therefore, we think our 1-day exclusion is reasonable and filters most of the abiotic CO<sub>2</sub> response from our analyses.

### Abiotic emissions

Abiotic emissions probably play a role in our analyses as well, as shown by the different results after applying filter 1 (“Data filters” section; Table 2). In MJ, the temperature is no longer a driver of annual GPP while it is in JA. However, JA T no longer impacts the GPP in JA. Furthermore, annual GPP shows a response to T in MJ and JA, but annual NEE does not show any significant relation with T in these bimonthly periods. This may indicate that CO<sub>2</sub> is released by subterranean ventilation, which has been found at several sites in the Mediterranean area (e.g., Serrano-Ortiz et al. 2007; Kowalski et al. 2008; López-Ballesteros et al. 2017). Karst systems, or carbonate soils, have the potential to store large amounts of CO<sub>2</sub> that can be released after dry periods under windy conditions (e.g., Sanchez-Cañete et al. 2011, 2016; Rey et al. 2012; Pérez-Priego et al. 2013; Roland et al. 2013). In our filter, we used a wind speed threshold of 0.5 m s<sup>-1</sup> as defined by Sánchez-Cañete et al. (2016); however, Rey et al. (2012) found that wind acts as a driver of CO<sub>2</sub> effluxes at higher values of 2 m s<sup>-1</sup> and Emmerich (2003) even at 5 m s<sup>-1</sup>, while a lower value of 0.3 m s<sup>-1</sup> is mentioned by Sanchez-Cañete et al. (2011). The filter was furthermore applied to all sites. Most studies on subterranean ventilation have been done at El Llano de los Juanes (ES-LJu) and some other Spanish sites that were not included in our analyses. However, we decided to test all sites as it was concluded by several studies that these processes may occur at other Mediterranean sites as well (Rey et al. 2012; Roland et al. 2013), and carbonate soils are

relatively common in Europe and parts of the Mediterranean area (Dürr et al. 2005).

### Future summer climate

Mediterranean summers are expected to become warmer and drier in general (Somot et al. 2008; Coumou and Robinson 2013), which could possibly lead to more abiotic emissions. However, these emissions also depend on wind speed, the projection of which is more uncertain in the future climate. Stilling (i.e., decrease in wind speed) has been observed over Europe over the last decades (Vautard et al. 2010; Bichet et al. 2012), although over the Mediterranean region the sign was unclear and sometimes even positive [Fig. 1 in Vautard et al. (2010); Table 2 in McVicar et al. (2012)]. During the summer season, most important for subterranean ventilation, a positive trend of mean wind (Azorin-Molina et al. 2014) and wind gust peaks (Azorin-Molina et al. 2016) was found over Spain and Portugal. Still, it is unclear how the wind speed will evolve over the coming decades. One of the possible explanations for the observed stilling is an increase in roughness length (Vautard et al. 2010) which could play a role in the Mediterranean region in the case of land abandonment. Besides temperature and wind, more variability and heavy and shorter rainfall is predicted (Christensen and Christensen 2003; Giorgi and Lionello 2008). The increased variability with more extremes could possibly lead to more extreme pulses, and therefore, higher CO<sub>2</sub> releases from the soil. Therefore, we recommend that future studies in the Mediterranean region also take abiotic emissions and summer rainfall pulses into account.

### Processes during autumn and winter

At many Mediterranean sites, a second peak of biological activity occurs after the summer, with the first autumn rainfall (Allard et al. 2008). This would raise expectations of a clear relationship between autumn PPT and GPP. However, we did not find any significant correlation. Seasonal NEE was, however, affected by PPT in SO (Table S3). This could mean a response of respiration to the rainfall, but we cannot confirm this with our analyses.

During winter, vegetation can still be active at some Mediterranean sites if the winter temperature does not drop too much, while the vegetation is mostly very well adapted to heat and water stress, it may not be able to survive low winter temperatures (Larcher 2000; Llorens et al. 2003; Aranda et al. 2005). Therefore, a positive relation could be expected between GPP and T. However, we did not find any response of temperature on GPP (and NEE) during this season (ND & JF) (Table 2; Table S3).

An aspect we did not investigate in our study is lagged effects. Below-zero temperatures during winter may induce

freezing-induced embolism, which can only be partly restored (Nardini et al. 2000; Cochard et al. 2001). These factors can predispose trees to drought and heat stress that are occurring during summer (Peguero-Pina et al. 2011). Bansal et al. (2015) and Sohn et al. (2012) found that winter conditions are sometimes more decisive for plant growth than summer aridity in some parts of the Mediterranean region. Future climate projections suggest an increase in air temperature in this area (Goubanova and Li 2007), reducing the possibility of impacts of cold winter temperatures on GPP later in the year. However, more variability and extremes, also during the winter, could lead to an increased number of freezing–thawing cycles. Lagged effects may also occur after severe spring or summer drought or other extreme events during the year. Another aspect that may affect the GPP of Mediterranean ecosystems is the succession of drought as predicted by climate models (Goubanova and Li 2007; Polade et al. 2014). Indeed, using dendrochronology some authors showed that repeated droughts in the past may have affected the biomass production of a given year (Badeau et al. 2011). Different adaptation strategies between species may largely impact their GPP response to climate change. For instance, Forner et al. (2018) showed that different water use efficiency and growth strategies between *P. nigra* and *Q. faginea* control their response to drought. Drought effects can even be amplified for trees facing competition for other resources (Linares et al. 2010; Grote et al. 2016). However, these mechanisms (Ryan 2011; Martínez-Vilalta and García-Forner 2017) are not taken into account in the current study and could be subject to future research.

### Conclusion

In this study, we investigated the response of GPP of Mediterranean ecosystems to different climatic variables. We used a large collection of sites with different vegetation types over the European Mediterranean region with the aim to identify the impact of annual and seasonal precipitation and air temperature on GPP. Using a large collection of sites is filling a gap between studies done only at one site with limited spatial but often high temporal resolution and studies done using satellite data with a better spatial representation but with less information on temporal dynamic. Our main findings are as follows:

1. The annual GPP is not predominantly controlled by the annual precipitation and annual air temperature.
2. Early spring precipitation seems to play a major role on the annual GPP with a positive effect.
3. Early summer air temperature has a positively effect on the annual GPP as well, although we found that both



dry season rainfall pulses and abiotic emissions play a role too and should not be neglected when carrying out studies in this region.

4. During the summer months (JA), both precipitation and temperature positively affect the GPP in these months.
5. The GPP in autumn and winter does not seem to be influenced by temperature and precipitation.

The sites used in our study were located in Europe, more precisely in France, Spain and Italy. To broaden our conclusions, more data could be used from other sites, also from non-European parts of the Mediterranean region. Furthermore, it would be interesting to add data for grasslands or other vegetation types as well to see if our conclusions hold over a broader range of Mediterranean sites, at least at sites where management is not the most important driver of GPP. Stand ages may also be a major driver for GPP but were not included in this analysis. Nevertheless, we showed that in the future, the reduction of spring precipitation will have a major impact on carbon storage of many different Mediterranean ecosystems.

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