

# Estimating canopy gross primary production by combining phloem stable isotopes with canopy and mesophyll conductances

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## Abstract

Gross primary production (GPP) is a key component of the forest carbon cycle. However, our knowledge of GPP at the stand scale remains uncertain, because estimates derived from eddy covariance (EC) rely on semi-empirical modelling and the assumptions of the EC technique are sometimes not fully met. We propose using the sap flux/isotope method as an alternative way to estimate canopy GPP, termed  $GPP_{iso/SF}$ , at the stand scale and at daily resolution. It is based on canopy conductance inferred from sap flux and intrinsic water-use efficiency estimated from the stable carbon isotope composition of phloem contents. The  $GPP_{iso/SF}$  estimate was further corrected for seasonal variations in photosynthetic capacity and mesophyll conductance. We compared our estimate of  $GPP_{iso/SF}$  to the GPP derived from PRELES, a model parameterized with EC data. The comparisons were performed in a highly instrumented, boreal Scots pine forest in northern Sweden, including a nitrogen fertilized and a reference plot. The resulting annual and daily  $GPP_{iso/SF}$  estimates agreed well with PRELES, in the fertilized plot and the reference plot. We discuss the  $GPP_{iso/SF}$  method as an alternative which can be widely applied without terrain restrictions, where the assumptions of EC are not met.

## KEYWORDS

boreal forest, intrinsic water-use efficiency, mesophyll conductance, nitrogen fertilization, phloem  $\delta^{13}C$ , PRELES, sap flux, stand transpiration

## 1 | INTRODUCTION

Gross primary production (GPP) represents a key flux in the carbon (C) budget of a forest ecosystem. GPP has been commonly estimated

using many approaches, such as eddy covariance (EC), empirical models and upscaling ecophysiological measurements at stand scale (Baldocchi, 2003; Beer et al., 2010; Peichl, Brodeur, Khomik, & Arain, 2010). However, there are still some uncertainties in these GPP

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estimates (Campbell et al., 2017). For example, accurate EC estimates are based on a set of assumptions, such as homogeneous flat terrain and turbulent mixing of air (e.g., Baldocchi, 2003). Because the assumptions are not always met, estimates are prone to ~20% uncertainty (Jocher et al., 2017; Keenan et al., 2019; Wehr et al., 2016).

EC data from periods when underlying assumptions are met can be used for the parameterization of a semi-empirical model such as PRELES (PREdict Light-use efficiency, Evapotranspiration and Soil water) to estimate GPP ( $GPP_{PRELES}$ ) in a given forest ecosystem (Mäkelä et al., 2008; Peltoniemi et al., 2015). PRELES can subsequently be used for gap-filling the EC data that have been filtered out or are otherwise missing. One of the advantages of PRELES is that it estimates ecosystem fluxes (GPP and evapotranspiration) by using routinely measured weather data. It means that  $GPP_{PRELES}$  can be estimated everywhere with no additional measurement than weather conditions (Tian, Minunno, Cao, Kallioikoski, & Mäkelä, 2020). This approach allows one to go back in time for estimating GPP of the boreal forest in years for which EC are not available (Minunno et al., 2016). The weakness of GPP estimates from PRELES is that its estimates are often unanchored by methods that are independent of EC. Previous studies that compared between biometric/component fluxes and GPP from EC ( $GPP_{EC}$ ) data have found that the GPP trends agreed reasonably well over several years, but often failed to find the same absolute values at annual scales (Curtis et al., 2002; Ehman et al., 2002; Peichl et al., 2010). These studies underlined two main kinds of errors, one due to EC measurements and the other due to the allometric equations and component fluxes. Thus, neither PRELES, EC, nor biometric methods can be considered an absolute standard. A previous study compared EC and dendrometric data and found a good correlation, but the dendrometric data do not provide flux estimates and thus require the development of site specific correlations (Zweifel et al., 2010).

A third, alternative approach for estimating GPP is to scale up tree-level ecophysiological measurements to the stand level. This approach requires the scaling of component fluxes such as leaf photosynthesis or sap flux. For example, the Conductance Constrained Carbon Assimilation model (4C-A) combined sap flux-based stomatal conductance with light-dependent photosynthetic parameters to produce vertically explicit photosynthesis estimates in both single- and multi-species stands (Kim, Oren, & Hinckley, 2008; Schäfer et al., 2003). These parameters were used to estimate the vertically explicit ratio between internal C concentration in the stomatal cavity ( $C_i$ ) and atmospheric C concentration ( $C_a$ ) ( $C_i/C_a$ ) or weighted by vertical leaf area distribution, a canopy-scale effective  $C_i/C_a$  at diurnal resolution. Although it described photosynthesis well (Schäfer et al., 2003), the method required detailed information on canopy architecture and gas exchange properties, which are not straightforward to obtain.

A simpler way forward is to infer intrinsic water use efficiency ( $WUE_i$ ) from  $\delta^{13}C$  (Cernusak et al., 2013; Ehleringer, Hall, & Farquhar, 1993). The  $\delta^{13}C$  method avoids the need to measure or assume photosynthetic parameters, as in the 4C-A model.  $WUE_i$  represents the ratio between net photosynthesis and the stomatal conductance ( $g_s$ ) to water vapour (Flexas et al., 2016). It is also equivalent to the  $CO_2$  diffusion gradient between the atmosphere and the

substomatal cavity when considering  $g_s$  for  $CO_2$  (Farquhar, O'Leary, & Berry, 1982). The  $WUE_i$  can be estimated from  $\delta^{13}C$  in phloem ( $\delta^{13}C_p$ ) contents, which estimates  $WUE_i$  at the tree scale (Ubierna & Marshall, 2011; Werner et al., 2012). The  $\delta^{13}C_p$  measurement integrates the signal from the whole canopy (Rascher, Máguas, & Werner, 2010), and therefore improves on Hu, Moore, Riveros-Iregui, Burns, and Monson (2010), who used a similar approach, but based their  $\delta^{13}C$  estimates on sugar extracts from foliage. Rascher et al. (2010) showed that the  $\delta^{13}C$  of water-soluble sugar decreased along the plant axis but to a small extent (~0.8%). They concluded that  $\delta^{13}C_p$  'does provide an integrative measure of changing canopy  $\Delta^{13}C$ '. The whole-tree scale of the calculated  $WUE_i$  thus matches the scale of the transpiration estimate.

Some studies using  $\delta^{13}C$  to estimate  $WUE_i$  (Seibt, Rajabi, Griffiths, & Berry, 2008; Wingate, Seibt, Moncrieff, Jarvis, & Lloyd, 2007) and GPP (Hu et al., 2010; Klein, Rotenberg, Tatarinov, & Yakir, 2016) have highlighted the importance of mesophyll conductance ( $g_m$ ). The  $g_m$  describes the ease with which  $CO_2$  can diffuse from the substomatal cavity to the chloroplasts, where carbon assimilation actually occurs (Flexas, Ribas-Carbó, Díaz-Espejo, Galmés, & Medrano, 2008; Warren & Adams, 2006). Because  $g_m$  is finite, assuming that it is infinite leads to an overestimation of  $WUE_i$  (Seibt et al., 2008; Wingate et al., 2007). Considering  $g_m$  associated with  $\delta^{13}C_p$  measurements would considerably improve GPP estimates, especially for conifers, which have relatively low  $g_m$  (Rascher et al., 2010). There is as yet no agreement about how to model  $g_m$ , but it has often been estimated from  $g_s$  (Warren, 2008).

We present a new semi-empirical GPP model, hereafter called  $GPP_{ISO/SF}$ , combining sap flux,  $\delta^{13}C_p$ , and mesophyll conductance based on approaches developed previously (Hu et al., 2010; Kim et al., 2008; Klein et al., 2016; Schäfer et al., 2003), and compare it with estimates from PRELES. We estimated  $GPP_{ISO/SF}$  of whole trees at a daily time step and then scaled it up to the stand level. The sap flow/isotopic method would, however, only consider the tree contribution to the ecosystem GPP, in contrast to PRELES, which considers the contribution of the whole ecosystem, including understorey and overstorey species. The understorey contribution from PRELES is in the process of being analysed. However, understorey GPP represents rather little of ecosystem GPP in a closed-canopy boreal forest (Kulmala et al., 2011; Palmroth et al., 2019; Tian et al., 2020). PRELES and the sap flow/isotopic method should therefore give similar results. The  $GPP_{ISO/SF}$  method can also provide information on how  $GPP_{ISO/SF}$  responds to fertilization in terms of assimilation and  $g_s$ .

A boreal forest is particularly suited for such a method comparison because of its simple species composition (Hänninen, 2016; Högberg, 2007). Moreover, because this biome is strongly nitrogen (N)-limited (Du et al., 2020), N additions induce a strong response in terms of growth and C fluxes [see reviews and references therein in Högberg, 2007 and Tamm (1991)]. These increases should be captured by all methods. However, a positive N-fertilization effect on GPP was not always observed. At our site, previous studies showed no effect of N supply on GPP when measured from biometrics (Lim et al., 2015) or shoot-scale gas exchange (Tarvainen, Lutz, Rantfors, Näsholm, & Wallin, 2016), but Tian et al. (2020), who used EC data to

parametrize a model, did find higher GPP in the fertilized plot than in the reference plot. Thus, the GPP results have been mixed, depending on which method was used.

The method we propose in this article aims to provide an alternative stand-scale estimate of GPP that is independent of EC. Our first objective here was to compare estimates of GPP based on stable isotopes and sap flux against GPP based on PRELES, a process-based model parameterized with EC data. The second objective was to determine how fertilization treatment influenced the canopy GPP with the sap flux/isotope method. Finally, the third objective explores alternative methods for incorporating an empirical  $g_m$  estimate and how these alternatives influence the GPP estimate.

## 2 | MATERIALS AND METHODS

### 2.1 | Experimental site

The study was carried out in a mature ~90-year-old Scots pine forest (*Pinus sylvestris* L.) at Rosinedal, near Vindeln in northern Sweden (64°10'N, 19°45'E) in 2012 and 2013. The site was an even-aged and mono-specific stand, located on sandy soil. Two 15-ha plots were studied; a fertilized plot (F) and a reference plot (R). In both plots, the sparse understory was dominated by Ericaceous shrubs, esp. *Vaccinium myrtillus* (L.) and *Vaccinium vitis-idaea*, (L.) mosses [*Pleurozium schreberi* (Bird.) Mitt.], *Hylocomium splendens* (Hedw.) Shimp and lichens (*Cladonia* spp.) (Hasselquist, Metcalfe, & Högberg, 2012; Hasselquist, Metcalfe, Marshall, Lucas, & Högberg, 2016). From 2006 to 2011, fertilizer was applied annually in mid-June to the F at a rate of 10 g N m<sup>-2</sup> year<sup>-1</sup>, but reduced to 5 g N m<sup>-2</sup> year<sup>-1</sup> in 2012 and thereafter, using Skog-Can Fertiliser (Yara, Sweden), containing NH<sub>4</sub> (13.5%), NO<sub>3</sub> (13.5%), Ca (5%), Mg (2.4%) and B (0.2%) (Lim et al., 2015).

### 2.2 | Environmental data

Environmental data included half-hourly relative humidity (RH, %), photosynthetic photon flux density (PPFD,  $\mu\text{mol m}^{-2} \text{s}^{-1}$ ), ambient temperature ( $T_a$ , °C), soil water content (SWC, m<sup>3</sup> m<sup>-3</sup>) and precipitation (mm) (Figure S1). PPFD was measured at the R plot only, and precipitation came from Svartberget station, which is located about 8 km from the study site. During the period 1981–2010, mean annual temperature and precipitation at Svartberget was 1.8°C and 614 mm, respectively (Laudon et al., 2013). Gaps in the meteorological data, due to instrument failure, were filled using measurements from the Svartberget forest. All abbreviations, their units and values of constants are summarized in Table 1.

The temperature data were used to define the 'thermal growing season', which estimates the period theoretically suitable for vegetation growth for a given year (Cornes, van der Schrier, & Squintu, 2019; Linderholm, 2006). The thermal growing season was defined to begin after the occurrence of five consecutive days with mean daily temperature > 5°C and the end was defined as the occurrence of five

consecutive days <5°C (Mäkelä et al., 2006). According to this definition, the 2012 growing season lasted from May 14 to October 10 and in 2013 from May 18 to October 14.

Atmospheric CO<sub>2</sub> concentration and  $\delta^{13}\text{C}$  ( $\delta^{13}\text{C}_a$ , ‰) were both collected from the National Oceanic and Atmospheric Administration database using the nearest sample station, at Pallas-Sammaltunturi in Finland. This was necessary to account for pronounced seasonal and annual variation in these variables at our high latitude.

### 2.3 | Measurements of $\delta^{13}\text{C}_p$

We measured the  $\delta^{13}\text{C}$  of the solutes in the fluid moving through the phloem ( $\delta^{13}\text{C}_p$ , ‰). Phloem samples were collected at breast height on 15 tree trunks in each plot with a cork-corer 9 mm in diameter. The samples were collected on October 18, 2011 and November 11, 2011 and then every 14 days from 26 April to 25 September, 2012. In the field, bark and wood were carefully removed and a disc, which included the active phloem, was dropped into a 6 ml vial containing 2 ml of exudation solution (15 mM polyphosphate buffer: sodium hexametaphosphate, Sigma, München, Germany). The solution was chosen to minimize the blockage of cut phloem cells without adding carbon to the exudate solution. The exudation lasted for 5 hr (Gessler, Rennenberg, & Keitel, 2004) and the exudate was then stored in a freezer until it was freeze-dried. Because the phloem solute concentration is much higher than in adjacent tissues, the exudate was dominated by phloem sap (Schneider et al., 1996), but some metabolites from living tissues might contaminate the phloem sample despite the careful preparation of the samples. The solutes were redissolved in 150  $\mu\text{l}$  and the resulting solution was pipetted into a tin capsule and dried at 60°C for 12 hr. The samples were then loaded into an elemental analyser (NA 2500; CE Instruments, Milan, Italy) coupled to an isotope ratio mass spectrometer (Delta Plus; Finnigan MAT GmbH, Bremen, Germany) for  $\delta^{13}\text{C}$  analysis. The analysis were performed at the SLU stable isotope laboratory (SSIL, Umeå, Sweden, [www.slu.se/en/departments/forest-ecology-management/ssil](http://www.slu.se/en/departments/forest-ecology-management/ssil)). Isotopic results were expressed in ‰ relative to VPDB (Vienna Pee Dee Belemnite). Amounts of carbon varied depending on the phloem contents at time of sampling, but they ranged from 400 to 1,400  $\mu\text{g}$ . The isotopic data were compared with reference standards calibrated against IAEA-600, IAEA-CH-6 and USGS40.

### 2.4 | Transpiration and canopy conductance estimates

We used the canopy transpiration model of Tor-Ngern et al. (2017) to avoid the need to repeat their scaling from trees to canopy. The model was originally derived using the measurements at the two plots in Rosinedal. Per-tree transpiration rates were derived from sap flux measured with Granier thermal dissipation probes (Granier, 1985, 1987) set in five to eight mature trees at varying depths in both the R and F plots (data and methods in Tor-Ngern et al. (2017)). Tree daily transpiration ( $E_{cd}$ , mm d<sup>-1</sup> tree<sup>-1</sup>) was then upscaled to stand level.

**TABLE 1** Abbreviations, definitions and units of all variables used in the study

Abbreviations	Definitions	Units	Constant values
A	Assimilation rate	$\text{g C m}^{-2} \text{ day}^{-1}$	
$a_a$	Fractionation during diffusion through air	‰	4.4
$a_i$	Fractionation during diffusion through water	‰	1.8
b	Fractionation during carboxylation	‰	29
$c_1$	Coefficient of proportionality	$\text{m}^3 \text{ mol}^{-1} \text{ } ^\circ\text{C}$	0.0367
$C_a$	Ambient $\text{CO}_2$ concentration	ppm	
$C_i$	Internal $\text{CO}_2$ concentration	ppm	
$E_{\text{cd}}$	Transpiration rate at stand level	$\text{mm day}^{-1}$	
$E_{\text{cdmax}}$	Maximal transpiration rate at stand level	$\text{mm day}^{-1}$	
f	Fractionation during photorespiration	‰	16.2
$g_m$	Internal conductance	$\text{mol m}^{-2} \text{ s}^{-1}$	
$g_{m\infty}$	Infinite value of $g_i$	$\text{mol m}^{-2} \text{ s}^{-1}$	$\infty$
$g_c$	Stomatal conductance at stand level	$\text{mol H}_2\text{O m}^{-2} \text{ day}^{-1}$	
$g_{c\hat{A}}$	Stomatal conductance at stand level corrected by $\hat{\alpha}$	$\text{mol H}_2\text{O m}^{-2} \text{ day}^{-1}$	
GPP	Gross primary production	$\text{g C m}^{-2} \text{ day}^{-1}$	
$\text{GPP}_{\text{EC}}$	Gross primary production estimated by eddy-covariance	$\text{g C m}^{-2} \text{ day}^{-1}$	
$\text{GPP}_{\text{iso/SF}}$	Gross primary production estimated by combined method with isotopic data and sapflow measurements	$\text{g C m}^{-2} \text{ day}^{-1}$	
$\text{GPP}_{\text{PRELES}}$	Gross primary production estimated by PRELES model	$\text{g C m}^{-2} \text{ day}^{-1}$	
LAI	Leaf area index	$\text{m}^2 \text{ m}^{-2}$	
$M_C$	Molar mass of carbon	$\text{g mol}^{-1}$	12
$M_{\text{H}_2\text{O}}$	Molar mass of water	$\text{g mol}^{-1}$	18
$n_D$	Number of day light hours	NA	
$P_{145}$	Atmospheric pressure at 145 m a.s.l	kPa	99.6
PPFD	Photosynthetic photon flux density	$\text{mol m}^{-2} \text{ day}^{-1}$	
R	Universal gas constant	$\text{J mol}^{-1} \text{ K}^{-1}$	8.314
r	Ratio of diffusivities of $\text{CO}_2$ and water vapour in the air	NA	1.6
$R_d$	Daytime respiration	$\text{g C m}^{-2} \text{ day}^{-1}$	
REW	Relative extractable water	NA	
RH	Relative humidity	%	
S(t)	State of photosynthetic acclimation ( $^\circ\text{C}$ ) at time t (day)	$^\circ\text{C}$	
$S_0$	Threshold value of the photosynthetic state of acclimation	$^\circ\text{C}$	-5.33
$\text{SWC}_{\text{FC}}$	Soil water content at field capacity	$\text{m}^3 \text{ m}^{-3}$	
$\text{SWC}_t$	Soil water content at sampling time	$\text{m}^3 \text{ m}^{-3}$	
$\text{SWC}_{\text{WP}}$	Soil water content at wilting point	$\text{m}^3 \text{ m}^{-3}$	
$T_a$	Ambient temperature	$^\circ\text{C}$	
$T_K$	Temperature	K	
$\text{VPD}_D$	Day light mean VPD	kPa	
$\text{VPD}_Z$	Normalized VPD	kPa	
$\text{WUE}_i$	Intrinsic water use efficiency	ppm	
$\hat{A}$	Photosynthetic capacity	$^\circ\text{C}$	
$\hat{A}_{\text{max}}$	Maximal photosynthetic capacity	$^\circ\text{C}$	
$\Delta$	Observed carbon discrimination during gas-exchange	‰	
$\delta^{13}\text{C}_a$	Ratio of heavy to light $^{13}\text{C}$ isotope in the air	‰	

(Continues)

TABLE 1 (Continued)

Abbreviations	Definitions	Units	Constant values
$\delta^{13}\text{C}_p$	Ratio of heavy to light $^{13}\text{C}$ isotope in phloem content	‰	
$\Gamma^*$	$\text{CO}_2$ compensation point	$\mu\text{mol mol}^{-1}$	
$\tau$	Time constant	day	8.23

The stand-level transpiration estimates were modelled from  $\text{VPD}_Z$  and relative extractable water (REW).  $\text{VPD}_Z$  is the integral of daytime mean atmospheric vapour pressure deficit. To estimate it, we first defined daytime as the period when PPFD exceeded a threshold of  $10 \mu\text{mol m}^{-2} \text{s}^{-1}$  (Hultine et al., 2008).  $\text{VPD}_D$  was then calculated (Murray, 1967; Ngao, Adam, & Saudreau, 2017) for the daylight period, as follows:

$$\text{VPDD} = 0.6108 \times e^{\frac{17.27 \times T_a}{T_a + 237.3}} \times \left(1 - \frac{\text{RH}}{100}\right). \quad (1)$$

Secondly,  $\text{VPD}_D$  (kPa) was integrated over the number of daylight hours (Oren, Zimmermann, & Terbough, 1996):

$$\text{VPDZ} = \text{VPDD} \times \frac{n_D}{24}, \quad (2)$$

with  $n_D$  being the number of daylight hours.  $\text{VPD}_Z$  thus combines daytime VPD and daylength in a single variable.

REW was calculated at 15 cm depth as follows (Granier, Loustau, & Bréda, 2000):

$$\text{REW} = \frac{\text{SWC}_t - \text{SWC}_{\text{WP}}}{\text{SWC}_{\text{FC}} - \text{SWC}_{\text{WP}}}, \quad (3)$$

where  $\text{SWC}_t$  is the mean volumetric soil water content ( $\text{m}^3 \text{m}^{-3}$ ) per day. SWC was measured with reflectometric soil moisture probes (SM300, Delta-T Devices, Cambridge, UK) at 15 cm depth.  $\text{SWC}_{\text{WP}}$  and  $\text{SWC}_{\text{FC}}$  are the soil water content at wilting point and field capacity, respectively. They were estimated from the annual minimum and maximum SWC, respectively, at our sites. The minimal SWC was used as a proxy of  $\text{SWC}_{\text{WP}}$  because it was similar to a three-year observations during drying cycle on our sandy site and close to the wilting point in a sand (Kätterer, André, & Jansson, 2006; Tor-Ngern et al., 2017). For the F plot,  $\text{SWC}_{\text{WP}}$  and  $\text{SWC}_{\text{FC}}$  were  $0.052$  and  $0.306 \text{ m}^3 \text{m}^{-3}$ , respectively, and for the R plot, the values were  $0.052$  and  $0.218 \text{ m}^3 \text{m}^{-3}$ .

Using the parameters above, the model of stand-level transpiration rate begins with an estimate of the maximal transpiration rate ( $E_{\text{cdmax}}$ ). It then adjusts the maximum rate downward for REW, as follows:

$$E_{\text{cdmax}} = 1.812 \times (1 - e^{-3.121 \times \text{VPDZ}}), \quad (4)$$

$$E_{\text{cd}} = E_{\text{cdmax}} \times (1 - e^{-18.342 \times \text{REW}}). \quad (5)$$

Equation (4) means that the maximal  $E_{\text{cdmax}}$  is  $1.812 \text{ mm day}^{-1}$  at high  $\text{VPD}_Z$ . It describes the net effect of increasing VPD as the driving

force for transpiration and decreasing stomatal conductance as VPD rises (Marshall & Waring, 1984; Oren, Phillips, Ewers, Pataki, & Megonigal, 1999). Equation (5) describes the further reduction that occurs as the soil dries.

Canopy conductance to  $\text{H}_2\text{O}$  was then inferred from corresponding  $E_{\text{cd}}$  and  $\text{VPD}_D$  as:

$$g_C = \frac{E_{\text{cd}}}{\frac{M_{\text{H}_2\text{O}}}{P_{145}} \times 1000} \times \frac{\text{VPDD}}{P_{145}}, \quad (6)$$

in  $\text{mol H}_2\text{O m}^{-2} \text{ ground area day}^{-1}$  with  $M_{\text{H}_2\text{O}}$  the molar mass of water ( $18 \text{ g mol}^{-1}$ ) and  $P_{145}$  the atmospheric pressure at 145 m a.s.l. ( $99.6 \text{ kPa}$ ). There is some circularity in this approach because VPD appears both in the estimation of  $E_{\text{cdmax}}$  and  $g_C$ . Long experience with these models, including tests against water-balance closure, have shown that the approach works (Tor-Ngern et al., 2017).

We applied two filters and one correction to these conductance data. Firstly, we accounted for the acclimation of photosynthetic capacity to air temperature (Mäkelä, Hari, Berninger, Hänninen, & Nikinmaa, 2004). We did this because of the tight coupling of photosynthesis and stomatal opening (Farquhar & Wong, 1984; Medlyn et al., 2011; Tuzet, Perrier, & Leuning, 2003), which allows us to account for the low stomatal conductance during the wintertime. Photosynthetic capacity  $\hat{A}$ , (called  $\hat{\alpha}$  in the original paper; Mäkelä et al., 2004) was estimated as follows:

$$\hat{A} = \max\{c_1 \times S(t) - S_0, 0\}, \quad (7)$$

where  $c_1$  a coefficient of proportionality ( $0.0367 \text{ m}^3 \text{mol}^{-1} \text{C}$ ),  $S(t)$  is the state of photosynthetic acclimation ( $^{\circ}\text{C}$ ) at time  $t$  and  $S_0$  a threshold value of the state of acclimation ( $-5.33^{\circ}\text{C}$ ).  $S(t)$  was obtained on daily time scale in two steps:

$$\Delta S(t) = \frac{T_a(t) - S_t}{\tau}, \quad (8)$$

where  $T_a(t)$  is daily mean temperature on day  $t$  and  $\tau$  the time constant (8.23 days)

$$S(t+1) = S(t) + \Delta S(t). \quad (9)$$

This model describes the linear increase in photosynthetic capacity with temperature in boreal conifers. We corrected our  $g_C$  values as follows (Mäkelä et al., 2008):

$$g_{CA} = \frac{\hat{A}}{\hat{A}_{\max}} \times g_C, \quad (10)$$

with  $\hat{A}_{\max}$  the mean value of  $\hat{A}$  when photosynthetic capacity was maximal. For  $\hat{A}_{\max}$ , we used the averages from July of 2012 and 2013. July was chosen because temperatures and PPFD were both high and the canopy was presumably near its photosynthetic capacity throughout this period.

Recall that  $g_C$  was estimated from  $VPD_D$  [Equation (6)]. Because  $VPD_D$  was in the denominator and approached zero in early spring, the estimates of  $g_C$  were often noisy at that time. Therefore, we filtered and removed all  $VPD_D$  values  $<0.1$  kPa. During the summer time (June–August), the filter threshold was increased to 0.25 kPa. The higher transpiration rate and a longer day-light period during summer created uncertainty in the  $g_C$  calculation (Emberson, Wieser, & Ashmore, 2000; Tarvainen, Rantfors, & Wallin, 2015), but we reduced the summer filter threshold to the minimum that would allow us to keep as many data as possible. We filled the resulting GPP gaps using a predictive model ( $g_C = a \times \hat{A} + b$ ) with  $a$  and  $b$  determined for each combination of treatments. We replaced the  $GPP_{\text{iso/SF}}$  outliers (beyond the 95% confidence interval of the predicted values) and filtered values by the predicted functions only during the thermal growing season. We did this because the common gapfill functions are based on EC data, and we wished to maintain our independence from EC data. The gaps were much larger outside the thermal growing season than within it, because tree photosynthesis is reduced during that time we chose not to fill these gaps.

## 2.5 | Carbon, discrimination, intrinsic water use efficiency and GPP calculations

Using the phloem samples collected between October 2011 and September 2012, we estimated isotopic discrimination against  $^{13}\text{C}$  ( $\Delta$ , ‰), assuming it was mainly constituted from photosynthetic carbohydrates. It was calculated as follows:

$$\Delta = \frac{\delta^{13}\text{C}_a - \delta^{13}\text{C}_p}{1 + \frac{\delta^{13}\text{C}_p}{1000}}. \quad (11)$$

We fitted linear interpolations (Figure S2) to determine a daily value of  $\Delta$ . This step allowed us to estimate  $GPP_{\text{iso/SF}}$  at a daily time scale. We assumed a constant diel value of  $\Delta$ . There is evidence of diel fluctuations in  $\Delta$  (Brandes et al., 2006; Gessler, Tcherkez, Peuke, Ghashghaie, & Farquhar, 2008), but they are rather small, especially in the lower stem. Rascher et al. (2010) did not find any significant diel variation studying *Pinus pinaster*. Because our purpose was to estimate GPP during the whole year at stand level, we argue that this short term variability would average out over the growing season. The literature also describes variation in  $\Delta$  between leaves and phloem contents and amongst compounds in the phloem; we address this variation in the Section 4.

The intrinsic water use efficiency for the stand ( $WUE_i$ ) was then inferred from the following equation, in each plot:

$$WUE_i = \frac{C_a}{r} \times \frac{b - \Delta - f \times \frac{\Gamma^*}{C_a}}{b - a\alpha + (b - a\iota) \times \frac{g_{CA}}{g_m}}, \quad (12)$$

where  $C_a$  is the atmospheric  $\text{CO}_2$  concentration ( $\mu\text{mol mol}^{-1}$ ),  $r$  the ratio of diffusivities of water vapour relative to  $\text{CO}_2$  in air (1.6),  $b$  the fractionation during carboxylation (29‰),  $f$  the fractionation during photorespiration (16.2‰; Evans & Caemmerer, 2013),  $a_\alpha$  and  $a_\iota$  the fractionations of the diffusion through air (4.4‰) and the fractionation of diffusion and dissolution in water (1.8‰), respectively, and  $g_m$  the mesophyll conductance ( $\text{mol CO}_2 \text{ m}^{-2} \text{ day}^{-1}$ ). The  $\text{CO}_2$  compensation point ( $\Gamma^*$ ,  $\mu\text{mol mol}^{-1}$ ), was calculated according to the following formula (Medlyn et al., 2002):

$$\Gamma^* = 42.75 \times e^{\frac{37830 \times (T_K - 298)}{298 \times T_K \times R}}, \quad (13)$$

with  $T_K$  the ambient temperature (K) and  $R$  the universal gas constant ( $8.314 \text{ J mol}^{-1} \text{ K}^{-1}$ ).

Equation (12) did not account for daytime respiration despite the effect it could have on  $^{13}\text{C}$  discrimination (Keenan et al., 2019; Tcherkez et al., 2017). However, a recent study proposed an improved model of carbon isotope discrimination; the daytime respiration ( $R_d$ ) would have an effect on lipids or amino acids biosynthesis, especially at low assimilation ( $A$ ) rate, but not on the carbohydrates that would be loaded into the phloem (Busch, Holloway-Phillips, Stuart-Williams, & Farquhar, 2020). Moreover, the phloem contents are dominated by photosynthate produced when  $A/R_d$  is high. Under these conditions, the respiration effect is small (Barbour, Ryazanova, & Tcherkez, 2017; Tcherkez et al., 2017). This agrees with observed  $\Delta e$ , the respiratory discrimination effect, by Stangl et al. (2019), which averaged only 0.13‰ at our site. Including this value in the  $WUE_i$  calculation would increase  $WUE_i$  by  $1.5 \pm 0.2\%$  and  $1.6 \pm 0.1\%$  in the F and the R plots respectively. Because this is well within the error, we have neglected this effect in the current study. Finally, there remain questions about the age of respiratory substrate and the size of the reduction in respiration in the daytime. These considerations lead us to the conclusion that the most parsimonious approach to modelling phloem contents was to neglect the respiration effect. We also used the  $\delta^{13}\text{C}_p$  from 2012 to estimate  $WUE_i$  for the same dates in 2013, assuming that  $WUE_i$  was mainly affected by  $g_{CA}$  and its link with  $VPD_D$  and not by the absolute values of  $\delta^{13}\text{C}_p$ . Similarly, we estimated  $\Delta$  in October and November 2012 and 2013 based on the 2011 measurements of  $\delta^{13}\text{C}_p$ .  $WUE_i$  was then calculated on a daily time scale, based on the daily-modelled values of  $\Delta$ .

Gross primary production ( $\text{g C m}^{-2} \text{ ground area day}^{-1}$ ) was then calculated from Equation (10) and Equation (12):

$$GPP_{\text{iso/SF}} = WUE_i \times g_{CA} \times \frac{M_C}{10^6}, \quad (14)$$

with  $M_C$  the molar mass of C ( $12 \text{ g mol}^{-1}$ ). The definitions of Wohlfahrt and Gu (2015) distinguish between ‘canopy net photosynthesis’, which includes carboxylation, respiration and photorespiration, ‘canopy apparent photosynthesis’, which includes only carboxylation and photorespiration, and ‘true photosynthesis’, which includes

carboxylation only. They point out that the flux-partitioning algorithms used to calculate 'GPP' with eddy-flux data are intended to estimate apparent photosynthesis (Wohlfahrt & Gu, 2015). The sap flux/isotopic estimate also provides an estimate of canopy apparent photosynthesis, at least in theory, because respiration is not allowed to influence the photosynthate pools loaded into the phloem. However, Wohlfahrt and Gu (2015) go on to note that the flux-partitioning used with eddy-flux data is inexact because it neglects the reduction in leaf respiration in the light. It is beyond the scope of the current manuscript to solve that problem, but we hope that it can be addressed in the near future.

## 2.6 | $g_m$ assumptions

We used three different assumptions to obtain  $g_m$  values:

- Constant  $g_m/g_{C\dot{A}} = 2.67$ . This approach allowed the  $g_m$  estimate to vary during the growing season.
- Constant  $g_m$ . This value was determined during several summer days, but was used throughout the year.
- Infinite  $g_m$  ( $g_{m\infty}$ ), meaning that in Equation (12), the  $\frac{g_{C\dot{A}}}{g_m}$  term tends to 0.

The values for  $g_m/g_{C\dot{A}} = 2.67$  and a constant  $g_m = 0.31 \text{ mol CO}_2 \text{ m}^{-2} \text{ s}^{-1}$  were calculated from discrimination against  $^{13}\text{C}$  measured at our site with a Picarro isotopic  $\text{CO}_2$  analyser (G2131-I, Picarro Inc., Santa Clara, CA, USA) and standard gas exchange according to Stangl et al. (2019).

## 2.7 | PRELES model

We used the PRELES model to derive  $\text{GPP}_{\text{PRELES}}$  for 2012 and 2013. The model was first parameterized using a Bayesian approach (e.g., Minunno et al., 2016; Tian et al., 2020) for Rosinedal with EC data available from 2014 to 2017 (Jocher et al., 2017). The model was run with environmental data measured on site (temperature, VPD, PPF and precipitation) in 2012 and 2013. Canopy leaf area index (LAI) was estimated in 2011–2013 (Lim et al., 2015), excluding understorey vegetation. The model predicts GPP at the stand level (Peltoniemi et al., 2015) and thus provides our best estimate of the year when the phloem samples were collected. We implemented PRELES with the daily mean of these data to get an estimation of  $\text{GPP}_{\text{PRELES}}$  in both R and F stands. It provided a comparison against our GPP calculations for 2012 and 2013.

## 2.8 | Model comparisons

To compare the PRELES estimates for 2012 and 2013 with the  $\text{GPP}_{\text{iso/SF}}$  estimate, we first chose to calculate  $\text{GPP}_{\text{iso/SF}}$  based on  $g_m/g_{C\dot{A}} = 2.67$  (Stangl et al., 2019). The constant ratio assumption is

widely used in the literature (Klein et al., 2016; Seibt et al., 2008). Secondly, we tested the  $\text{GPP}_{\text{iso/SF}}$  estimate in the F plot against the R plot. Finally, the annual sums were calculated and compared for  $\text{GPP}_{\text{iso/SF}}$  and  $\text{GPP}_{\text{PRELES}}$  in 2012 and 2013. We combined 2012 and 2013 in order to estimate the inter-annual variability of the different approaches. The standard deviation (SD) was calculated from the mean annual sum in 2012 and 2013.

## 2.9 | Statistics

There was no replicate of the R and F treatments so it was impossible to perform analyses of variance to infer any fertilization effect. However, we could not ignore the effect of the fertilization on the F plot (Lim et al., 2015). We therefore presented the plot differences recognizing that they may include a pre-existing plot effect as well as a fertilizer effect.

However, because 15 trees were sampled at each site for  $\delta^{13}\text{C}_p$  estimate, we did analyse a 'plot effect'. We performed the same analyses of variance with  $\text{WUE}_i$  which could be estimated for all of the 15 trees at each date. When necessary,  $\delta^{13}\text{C}_p$  and  $\text{WUE}_i$  data were log-transformed to meet normality and homoscedasticity requirements. Temporal variations of  $\delta^{13}\text{C}_p$  and  $\text{WUE}_i$  were analysed with a linear mixed model to take into account the repeated  $\delta^{13}\text{C}_p$  sampling within individual trees in 2012. 'Sampling date', 'plot' and 'plot  $\times$  sampling date' were assigned as fixed factors, whereas the 'tree identity' was considered as a random factor. Similarly, we determined the variance between the different annual sums of  $\text{GPP}_{\text{iso/SF}}$  (according to the three  $g_m$  assumptions) and with  $\text{GPP}_{\text{PRELES}}$ : 'plot' and 'method' (three  $g_m$  assumptions + PRELES) factors were tested on the mean value in 2012–2013. Daily GPP regressions were run with a first-order autoregressive structure, applying the `corAR1` correlation option. The analyses were performed with R `nlme` package (Pinheiro, Bates, DebRoy, & Sarkar, 2016). The ANOVA function from 'car' library and multiple pairwise comparisons (library 'lsmeans' and 'multcompView') were performed.

Finally, we applied a Monte Carlo method to analyse the error propagation in our  $\text{GPP}_{\text{iso/SF}}$  model. This approach was already used in a previous study estimating GPP over a few days (Hu et al., 2010). We randomly sampled from the uncertainty ranges of  $\Delta$ ,  $E_{cd}$  and  $g_m/g_{C\dot{A}}$  to calculate  $\text{GPP}_{\text{iso/SF}}$  in an iterative manner (1,000 times). The seasonal pattern of  $\Delta$  was modeled with the loess method (Cleveland, Grosse, & Shyu, 1992). The uncertainty of daily  $\Delta$  was estimated based on the residual variance in the curve fitting. Uncertainty of  $E_{cd}$  [from Equations (4) and (5)] was calculated based on the original regression analysis of the transpiration model in Tor-Ngern et al. (2017). Uncertainty of  $g_m/g_{C\dot{A}}$  was estimated based on the field measurements in Stangl et al. (2019). Uncertainty of  $\Gamma^*$  [from Equation (13)] was estimated based on the mismatches in the original model fitting in Bernacchi, Singaas, Pimentel, Portis, and Long (2001). Errors in those inputs were assumed to follow normal distributions or truncated normal distributions (see Table S1). The 95% confidence intervals were calculated to illustrate the predictive uncertainty in our  $\text{GPP}_{\text{iso/SF}}$  estimate (Figure S3). The Sobol indices (Saltelli et al., 2008)

were also calculated to partition the variance into these uncertainty sources (Table S1). This method allows us to deal with the absence of replicate sites.

Using Bayesian calibration, we adjusted parameters of PRELES according to their ability to reproduce EC observations (Tian et al., 2020). The Bayesian framework treated all terms in the model calibrations and predictions as probability distributions (Clark, 2007; Dietze, 2017). The joint posterior distribution of parameters was obtained using Markov chain Monte Carlo sampling techniques (Hastings, 1970; Metropolis, Rosenbluth, Rosenbluth, Teller, & Teller, 1953). Meanwhile, the probability density distribution of measurement error was estimated. Based on the parametric uncertainty from the joint posterior distribution and the measurement uncertainty from the error distribution, we estimated the 95% confidence intervals of daily GPP predictions, which describes the ranges of EC observations that could possibly occur.

All analyses were conducted with R software, version 3.5.1 (R Core Team, 2016).

### 3 | RESULTS

#### 3.1 | Environmental data

We first present seasonal variations of the precipitation, PPF, temperature and  $VPD_z$  in 2012 and 2013, which were typical of boreal forests (Figure S1). The annual mean temperature during 2012 and 2013 was 1.6 and 3.3°C, and the total precipitation 796 and 542 mm respectively. Precipitation was relatively high during the thermal growing season limiting the potential for drought during the growth period. The light level increased almost 3 months before the start of

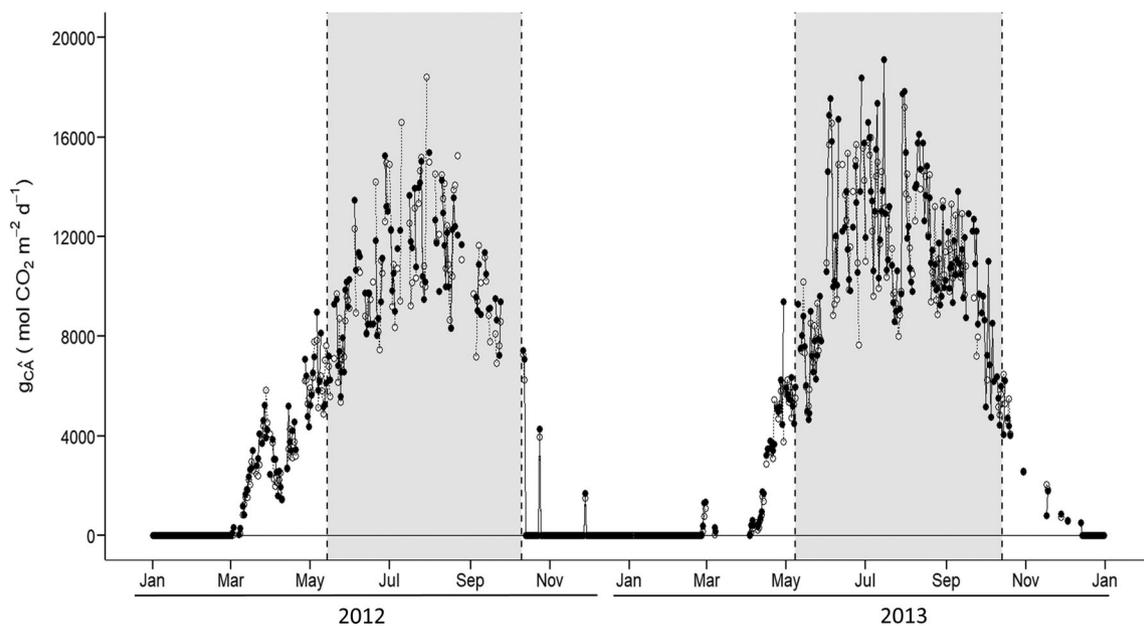
the thermal growing season and the maximum values were in June before they decreased until winter. The temperatures were the highest in July–August and reached very low values in winter. Temperatures stayed below zero for several months. Finally,  $VPD_z$  was highest during the thermal growing season although its increase started around March for both years.  $VPD_z$  showed high variability over the whole year.

#### 3.2 | Stand canopy conductance

Stand conductance,  $g_{c\hat{A}}$ , is an important component of the estimation of  $GPP_{iso/SF}$ . Stand conductance showed strong seasonal trends with no difference between the F and the R plot (Figure 1).  $g_{c\hat{A}}$  started to increase in both plots on March 12 in 2012 and on April 14 in 2013. The difference was due to low temperatures in March 2013 compared with 2012. The winter and fall periods rarely showed any positive conductance because the  $VPD$  and  $\hat{A}$  corrections filters forced the values to zero. Rates were highest from early June until the beginning of September, which is the core of the thermal growing season. During this period, the ratio  $\hat{A}/\hat{A}_{max}$  was close to 1 (Figure S4) meaning that photosynthetic capacity had reached its seasonal maximum (Mäkelä et al., 2008). Conductance fell through September and October, returning to zero in both plots on October 25, 2012 and December 4, 2013 (Figure 1).

#### 3.3 | Isotopic data

Isotopic data from the atmosphere and from the phloem were also used to infer  $WUE_i$ . We observed strong, but different, patterns of



**FIGURE 1** Canopy conductance corrected by  $\hat{A}$  for the fertilized (black circles, solid lines) and the reference (white circles, dashed lines) plots in 2012 and 2013. Grey areas represent the thermal growing seasons

seasonal variation for atmospheric  $\delta^{13}\text{C}_a$  and for phloem contents ( $\delta^{13}\text{C}_p$ ). From January to the beginning of February,  $\delta^{13}\text{C}_a$  decreased to a minimum of  $-9.2\text{‰}$  (Figure 2a). Then  $\delta^{13}\text{C}_a$  increased rapidly, by about  $1\text{‰}$ , during the initial weeks of high photosynthesis in late June and early July. The main peaks of  $\delta^{13}\text{C}_a$  occurred during the thermal growing season, when canopy conductance was also the highest. It then stabilized until late September, when it again began to fall (Figure 2a). In contrast, the phloem data (Figure 2b) did not simply track the atmosphere. Instead they showed a steep drop only at the beginning of the thermal growing season. The  $\delta^{13}\text{C}_p$  value depended significantly on the date ( $p$  value  $<.0001$ ,  $df = 1$ ,  $F = 53.09$ ; Figure 2b). It was significantly higher in the F plot ( $-27.5\text{‰}$ ) than in the R plot ( $-28.0\text{‰}$ ;  $p$  value  $<.0001$ ,  $df = 1$ ,  $F = 76.96$ ) as well.

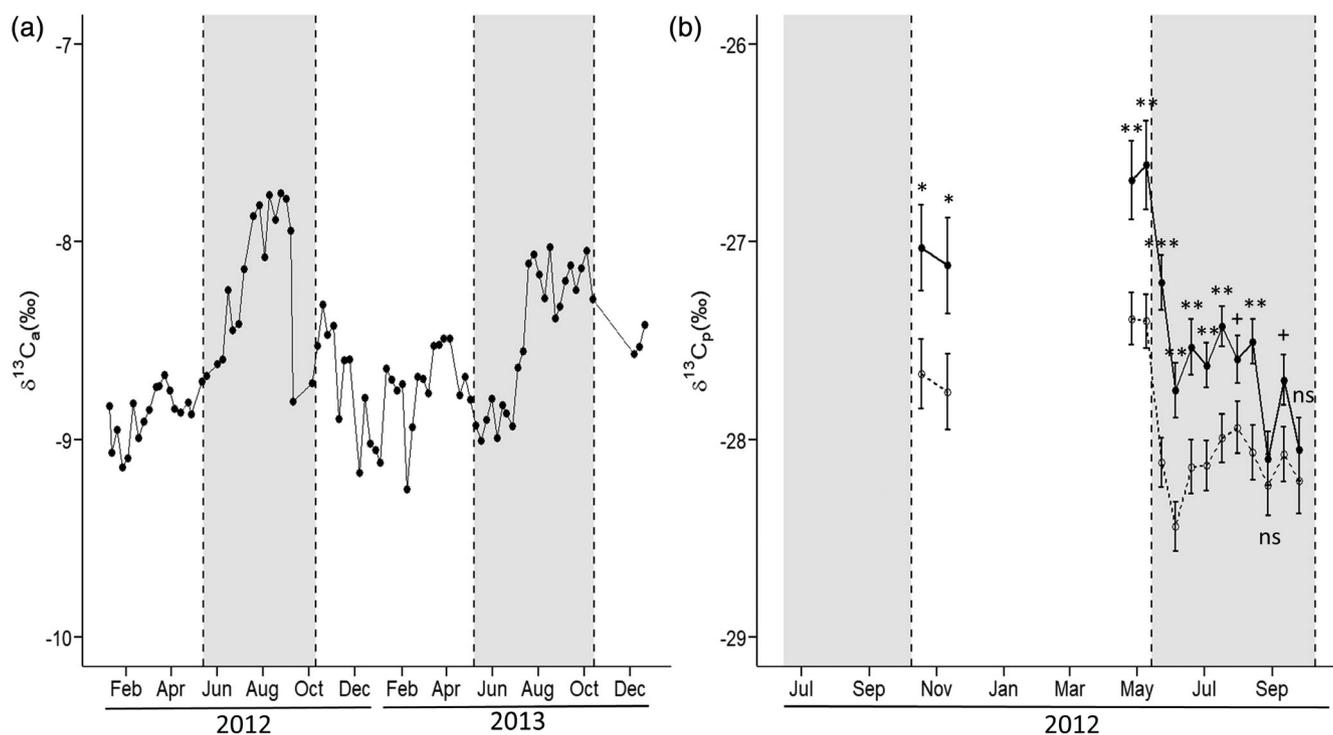
### 3.4 | Intrinsic water use efficiency (WUE<sub>i</sub>)

WUE<sub>i</sub> is a key variable in the GPP<sub>iso/SF</sub> estimation procedure (Figure 3). For all three  $g_m$  assumptions, WUE<sub>i</sub> showed a significant seasonal pattern ('date' effect,  $p$  value  $<.0001$ ,  $df = 1$ ,  $F = 29$ ), decreasing sharply as the thermal growing season began and increasing as it ended (Figure 3). WUE<sub>i</sub> also decreased gradually over the summer. In 2012, the mean values on the fertilized plot were 6% higher for  $g_{m\infty}$ , 7% higher for  $g_m/g_{CA}$  and 9% higher for,  $g_m = 0.31 \text{ mol CO}_2 \text{ m}^{-2} \text{ s}^{-1}$  respectively. In 2013, the relative increase in WUE<sub>i</sub> on the F plot was similar: 6, 7 and 8% respectively. For both years, there was a significant 'plot'

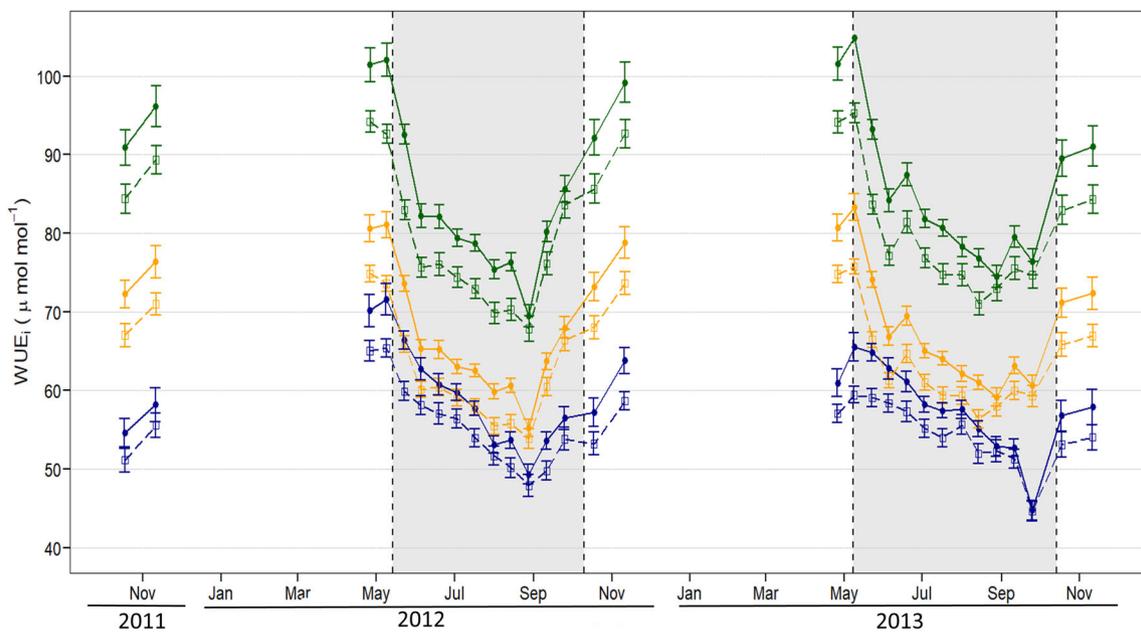
effect ( $p$  value  $<.0001$ ,  $df = 1$ ) and a significant effect of the  $g_m$  assumptions ( $p$  value  $<.0001$ ,  $df = 2$ ) (Figure 3).

### 3.5 | Comparison of GPP estimates

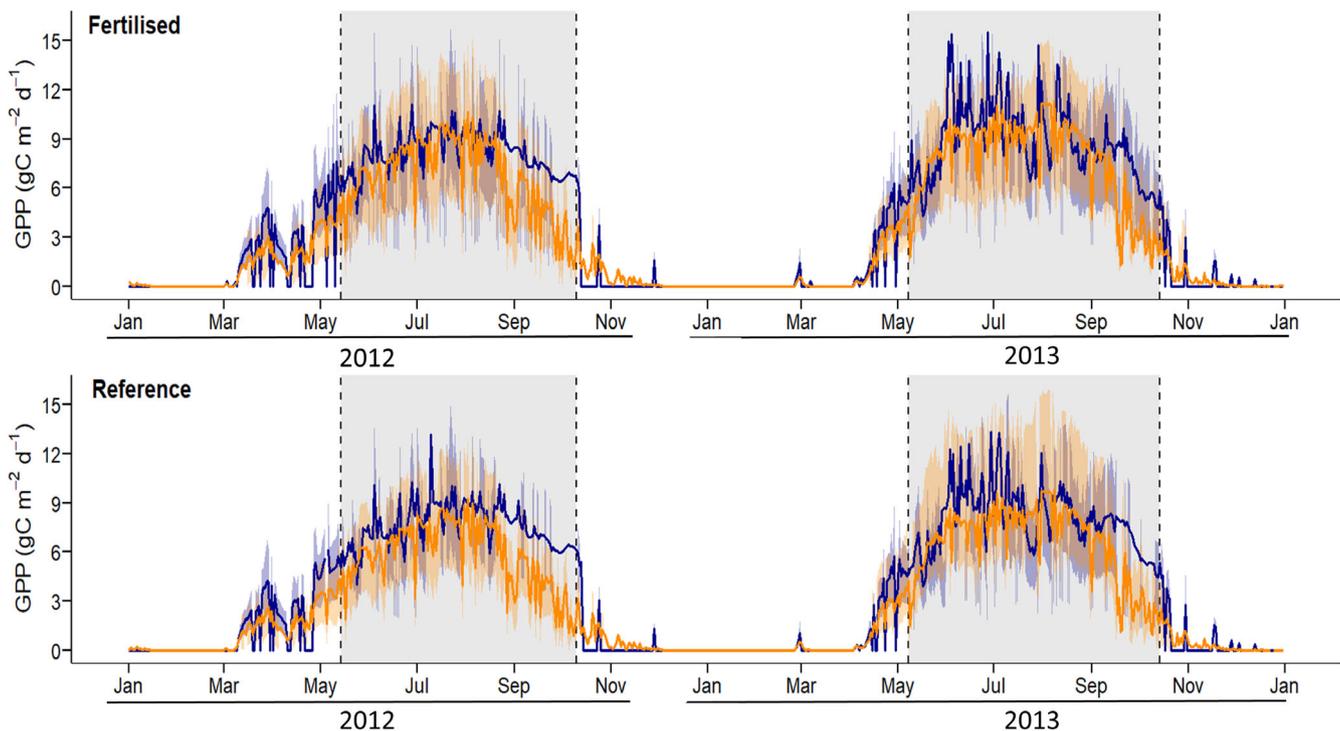
Our first objective was to compare GPP<sub>iso/SF</sub> with GPP<sub>PRELES</sub> for 2012 and 2013. To simplify the figure, we chose to represent only the assumption that  $g_m/g_{CA} = 2.67$  (Figure 4), which allows  $g_m$  to vary during the season. The seasonal GPP patterns were similar between PRELES and the sap flux/isotopic method (Figure 4). Recall that GPP<sub>PRELES</sub> included understorey vegetation. Correlation coefficients amongst methods and plots were all high, with minimum  $r = 0.91$  (Figure S5). However, the fit was nonlinear; in 2012 and 2013, GPP<sub>iso/SF</sub> approached an asymptote at high levels of GPP<sub>PRELES</sub> (Figure S5). The highest GPP<sub>PRELES</sub> values did not match with the highest GPP<sub>iso/SF</sub> values; the peak of GPP<sub>iso/SF</sub> occurred earlier in the season than those of GPP<sub>PRELES</sub>. Interestingly, confidence intervals for GPP<sub>iso/SF</sub> and GPP<sub>PRELES</sub> overlapped most of the time, even during the fall, when the offset was bigger than the rest of the year. However, the VPD filters removed many values during the fall, which allowed us to draw a confidence interval only during small periods at that time. As previously mentioned, the GPP values were gapfilled to draw a complete seasonal pattern, at least during the thermal growing season. The resulting annual sums were higher for GPP<sub>iso/SF</sub> than for PRELES on the control plot, but not on the fertilized plot (Figure 5a).



**FIGURE 2** Atmospheric  $\delta^{13}\text{C}_a$  signature in 2012 and 2013 (a) and phloem  $\delta^{13}\text{C}_p$  signature in 2012 (b)  $\pm$ SE ( $n = 15$ ). ns, +, \*, \*\*, and \*\*\* correspond to  $p \geq .1$ ,  $p < .1$ , .05, .01 and .001, respectively, after pairwise comparison between the F plot and the R plot for each date. Grey areas represent the thermal growing seasons. The fertilized plot is represented in black circles and solid line and the reference plot in white circles and dotted line



**FIGURE 3** Intrinsic water use efficiency at stand level ( $WUE_i$ ) for fertilized (filled circles and solid line) and reference plot (empty squares and dashed line) in 2012 and 2013, assuming a  $g_{m\infty}$  assumption (green), a  $g_m/g_{cA} = 2.67$  assumption (yellow) or a  $g_m = 0.31 \text{ mol CO}_2 \text{ m}^{-2} \text{ s}^{-1}$  assumption (blue). Grey areas represent the thermal growing season. Statistical results comparing  $WUE_i$  between fertilized and reference plots: \*\*\* correspond to  $p < .001$  after anova



**FIGURE 4** Daily  $GPP_{PRELES}$  (orange) and  $GPP_{iso/SF}$  (blue) in the fertilized plot (upper row) and in the reference plot (lower row). Shaded areas around the curves represent the Monte Carlo uncertainties. The shaded boxes represent the thermal growing seasons

### 3.6 | Fertilization effect

Our second objective was to assess the effect of fertilization on GPP. Using the annual sums, neither  $GPP_{iso/SF}$  nor  $GPP_{PRELES}$  was

significantly different between the F and the R plots (Figure 5a). However, there were consistent trends;  $GPP_{iso/SF}$  was higher by 10% in the F plot than in the R plot and  $GPP_{PRELES}$  was higher by 16% (Figure 5a). Using the daily data corrected for autocorrelation, we

found a significant increase in the F plot;  $GPP_{iso/SF}$  was higher by 8% and  $GPP_{PRELES}$  was higher by 16% (Table 2 and see Figure S6).

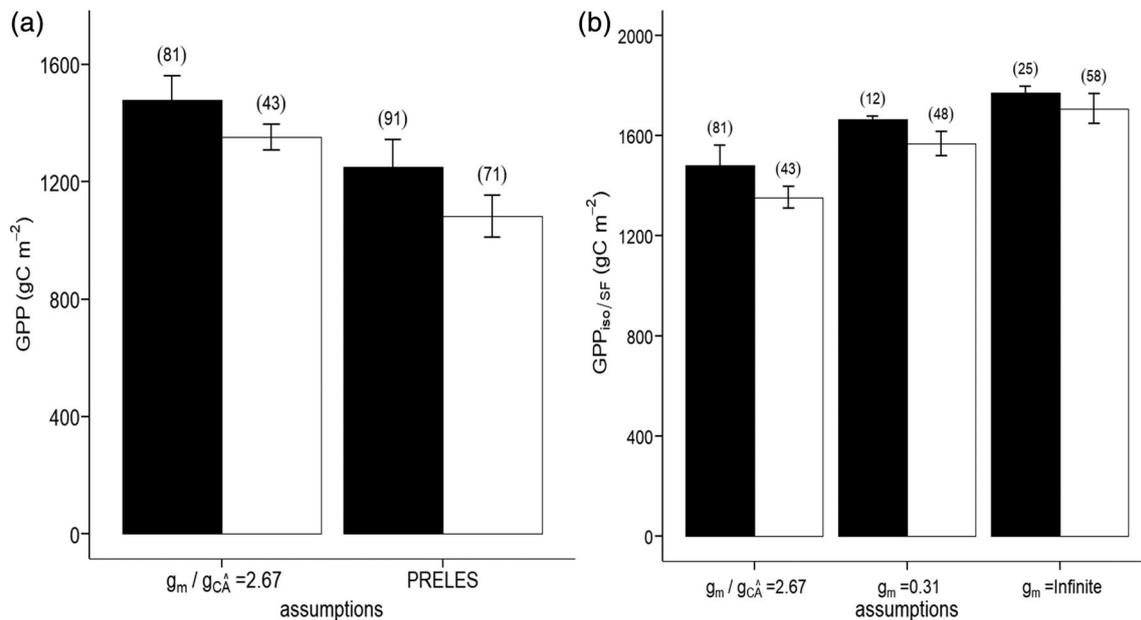
### 3.7 | Mesophyll conductance assumptions

The third objective was to compare  $GPP_{iso/SF}$  using different methods of estimating  $g_m$ . Globally, there was a significant effect of 'plot' ( $p$  value = .007,  $df = 5$ ,  $F = 19$ ) and ' $g_m$  assumptions' ( $p$  value = .0002,  $df = 5$ ,  $F = 75$ ). Focussing on one plot at a time, we found a significantly lower  $GPP_{iso/SF}$  in the control plot estimates when using  $g_m/g_{c\hat{A}} = 2.67$  as compared with the others. In the F plot, we found significantly lower  $GPP_{iso/SF}$  of  $g_m/g_{c\hat{A}} = 2.67$  compared with  $g_{m\infty}$ . The F plot was not significantly different from the R plot by any of these methods (Figure 5b).

## 4 | DISCUSSION

Our study provided a new and simple method of independently estimating GPP and compared it with estimates from PRELES, a model parameterized with EC data. The two methods yielded similar estimates for both annual totals and seasonal patterns. We then used the two methods to compare a fertilized to an unfertilized plot. Both methods detected higher GPP on the F plot, but only when using the more abundant daily estimates (Table 2, Figure S5).

Several previous studies have estimated GPP from Scots pine forests in northern Europe. Such EC estimates include  $1,001 \text{ g C m}^{-2} \text{ year}^{-1}$  (Magnani et al., 2007),  $940 \text{ g C m}^{-2} \text{ year}^{-1}$  (Kolari et al., 2004),  $1,047 \text{ g C m}^{-2} \text{ year}^{-1}$  (Lagergren et al., 2008) and  $1,072 \text{ g C m}^{-2} \text{ year}^{-1}$  (Duursma et al., 2009). There have been two estimates that were independent of EC. The first was a chamber-based estimate of  $982 \text{ g C m}^{-2} \text{ year}^{-1}$



**FIGURE 5** Annual sum of GPP for sap flux/isotopic (mean 2012 and 2013) method corrected by  $\hat{\alpha}$  considering the  $g_m$  assumption,  $g_m/g_{c\hat{A}} = 2.67$  and PRELES (a) or considering the  $g_m$  assumption,  $g_m = 0.31 \text{ mol CO}_2 \text{ m}^{-2} \text{ s}^{-1}$  and  $g_m$  infinite (b). Black bars correspond to the fertilized plot and the white bar to the reference plot. Errors bars correspond to standard deviation and their values are in brackets. Letters shows the statistical differences ( $\alpha = .05$ ) between the treatment combinations (modelling approach  $\times$  fertilization treatment). GPP, gross primary production

**TABLE 2** Coefficients of the linear regression (corrected for autocorrelation) between daily GPP in the fertilized plot and daily GPP in the reference plot across methods and years

Method	$g_m$ assumptions	2012			2013		
		Slope	$\pm SE$	$R^2$	Slope	$\pm SE$	$R^2$
$GPP_{iso/SF}$	$g_m/g_{c\hat{A}} = 2.67$	1.06 ( $\pm 0.008$ )***	0.05 ( $\pm 0.04$ )	.98	1.10 ( $\pm 0.01$ )***	0.04 ( $\pm 0.05$ )	.98
	$g_m = 0.31$	1.07 ( $\pm 0.006$ )***	0.04 ( $\pm 0.04$ )	.99	1.03 ( $\pm 0.008$ )***	0.08 ( $\pm 0.05$ )	.98
	$g_{m\infty}$	1.06 ( $\pm 0.006$ )***	0.05 ( $\pm 0.04$ )	.99	0.97 ( $\pm 0.01$ )***	0.27 ( $\pm 0.07$ )***	.96
$GPP_{PRELES}$		1.15 ( $\pm 1E-6$ )***	$-3E-6$ ( $\pm 3E-6$ )	.99	1.16 ( $\pm 0.001$ )***	0.01 ( $\pm 0.006$ )	.99

Abbreviation: GPP, gross primary production.

Na, \*, \*\* and \*\*\* correspond to  $p < .1$ , .05, .01 and .001, respectively, after  $t$  test when comparing the slope of the regressions with 1:1 regression.

(Zha, Xing, Wang, Kellomäki, & Barr, 2007). The second, based on earlier measurements of NPP at our site, was  $\sim 1,000 \text{ g C m}^{-2} \text{ year}^{-1}$  (Lim et al., 2015). We compared our  $\text{GPP}_{\text{iso/SF}}$  estimate minus our standard deviation for the reference plot ( $1,350 - 43 = 1,307 \text{ g C m}^{-2} \text{ year}^{-1}$ ) to the mean of these published values plus the standard deviation ( $1,007 + 43 = 1,050 \text{ g C m}^{-2} \text{ year}^{-1}$ ) and found that the published values were consistently lower than our  $\text{GPP}_{\text{iso/SF}}$  estimate. We next discuss the strengths and weaknesses of each method.

#### 4.1 | Strengths and weaknesses of PRELES

The key advantage of PRELES is that it is a compromise between predictive accuracy and model complexity. It can be calibrated with a few variables derived from EC measurements. Once it is calibrated, it can be run with an even smaller set of environmental variables (VPD, PPF, precipitation and air temperature). The required EC data are available from many sites around the world (Baldochi, 2003). PRELES has been reported to work well in all boreal forests (Minunno et al., 2016; Tian et al., 2020). Based on this assessment, we felt justified in using it, with calibration from 2014 to 2017 and environmental data from 2012 to 2013, to model carbon fluxes in 2012 to 2013.

Although the availability of EC data is an advantage for PRELES, EC data must be viewed with caution. In particular, at our site, preliminary analyses of the data revealed significant problems in the data despite the flat ground surface, uniform canopy and low leaf area index. A careful study of the problem revealed significant decoupling of the above- and below-canopy air masses, which often led to advection (Jocher et al., 2018). It is common for EC studies to use a vertical wind speed cutoff, the  $u^*$  filter, to detect and remove such events (Aubinet et al., 2001; Papale et al., 2006). We found that the  $u^*$  filter was insufficient and that a measurement relying on the comparison of below-canopy and above-canopy vertical wind speeds was required (Jocher et al., 2018). This concern was earlier raised in another boreal forest in Finland (Alekseychik, Mammarella, Launiainen, Rannik, & Vesala, 2013). We used a decoupling filter (Thomas, Martin, Law, & Davis, 2013), which is still unusual in the EC community, to correct the EC data that were used to parametrize PRELES in this study. Unless this correction was performed, PRELES would have been parameterized incorrectly if we wished to quantify total ecosystem fluxes; it would only have described the decoupled fluxes.

#### 4.2 | Strengths and weaknesses of sap flux/isotopic approach

##### 4.2.1 | Combination of sap flux and isotopic measurements

The key advantage of the sap flux/isotopic approach is that it is independent of EC. Moreover, it leans on two methods, sap flux (Poyatos et al., 2007) and isotopic measurements (Bowling, Pataki, & Randerson, 2008, and references therein) that have been widely used

at many sites by ecosystem ecologists. The sap flux/isotopic approach combines them to estimate GPP at the tree scale, which can then be scaled up to the stand. In simple stand structures, that scaling is relatively easy. We used a model of sapflux based on measurements at our site scaled up in this way. It provided a simple method to estimate tree GPP that, in combination with measurements of ground vegetation GPP, yields an alternative estimate for comparison with GPP estimated by EC.

One critical advantage of the sap flux/isotopic method for estimating GPP is that its requirements for the terrain and atmospheric conditions are less restrictive than for EC measurements. It thus provides an empirical method that can be applied in hilly topography, complex canopy structure and non-turbulent atmospheres.

##### 4.2.2 | Phloem contents and isotopic interpretation

The sap flux/isotopic method also has several important limitations. The literature describes several post-photosynthetic modifications in the isotopic composition of the carbon that appears in the phloem (Cernusak et al., 2009), which might interfere with our interpretation of the phloem contents as representative of the photosynthate, and finally with our  $\text{WUE}_i$  estimates (Brandes et al., 2006; Dubbert, Rascher, & Werner, 2012; Gessler et al., 2008; Merchant et al., 2012). Especially pronounced are the modifications that occur when the beta-oxidation pathway is activated, as when lipids and lignin are produced. These modifications are especially strong when lipid or lignin concentrations are high, as in bulk leaf tissue (Bowling et al., 2008). However, lipids and lignin are not abundant in phloem contents because their function is not related to transport and they are largely insoluble in water. In fact, their near absence would suggest that phloem contents are less likely to show evidence of such modifications than bulk tissue. In this sense, theory would suggest that phloem contents provide a better estimate of  $\Delta$  of raw photosynthate than does bulk leaf tissue.

Another set of post-photosynthetic modifications have been attributed to transport into and out of the phloem during downward vertical transport. If these modifications reflected additions of photosynthate from shaded branches, they might improve our estimates of whole-canopy photosynthesis. However, if they were due to leakage and refilling with an isotopic fractionation, then they would degrade our estimates (Gessler et al., 2009). In a detailed analysis of vertical changes in phloem composition in Scots pine at our site, we were unable to detect a vertical  $\delta^{13}\text{C}$  gradient (data not shown). This argues that the isotope signal is preserved during transport.

Post-photosynthetic modifications may also result from chloroplast starch hydrolysis and phloem loading. Starch hydrolysis leads to diurnal changes in the isotopic composition of the sugars derived from it (Gessler et al., 2009). In one study, the sugars leaving the leaf in the phloem had nearly the same isotopic composition as the starch being hydrolyzed (Gessler et al., 2007). This result suggests that the photosynthates were not substantially altered upon phloem loading.

Conversely, some authors have found differences between  $\delta^{13}\text{C}$  of leaf soluble organic matter and the sugars in the phloem (Brandes et al., 2006). This latter comparison assumes that the entire pool of leaf soluble organic matter is available for export and that insoluble compounds, like starch, are not used as substrate for export. If the assumption is true, it would suggest fractionation upon loading into the sieve tubes (Hobbie & Werner, 2004).

Isotopic changes in phloem contents could also arise from compound-specific isotopic signatures in the phloem. Such differences amongst compounds have been observed in phloem contents (Smith, Wild, Richter, Simonin, & Merchant, 2016; Offerman, Ferrio, Holst, Grote, Siegwolf, Kayler, & Gessler, 2011) and they were especially noteworthy in the polyols in Douglas-fir xylem sap (Bögelein, Lehmann, & Thomas, 2019), which represented 37% of the phloem solutes and were approximately 2‰ more depleted than sucrose. It is not clear where the heavy carbon would go at polyol synthesis, but one might expect that it is retained in the substrates. Similarly, phloem sap contains N-compounds (e.g., amino acids and polyamines) as well. The  $\delta^{13}\text{C}$  analysis of phloem contents allowed us to determine a C:N ratio, which was  $119 \pm 32$  (SD) and  $42 \pm 20$  in the R plot and the F plot, respectively. On both plots, the values were high enough to consider that non sugar compounds would have a small effect on the global isotopic signature. We acknowledge that a more detailed analysis would improve our predictions. In the meantime, we have assumed that the bulk fractionation is negligible.

Phloem contents must be used carefully before photosynthesis begins in spring. During this period before photosynthesis has begun, the phloem must contain mobilized C reserves (Dubbert et al., 2012; Gessler et al., 2004). This would clearly not yield estimates of current  $\text{WUE}_i$  (Michelot, Eglin, Dufrêne, Lelarge-Trouverie, & Damesin, 2011). As soon as the environmental conditions improve in spring, stomatal conductance increases, the phloem fills with new photosynthates, and  $\delta^{13}\text{C}_p$  begins to fall. This process may explain why  $\delta^{13}\text{C}_p$  was highest outside the thermal growing season and decreased when photosynthetic activity recovered. Without correcting the  $\text{WUE}_i$ , the annual  $\text{GPP}_{\text{iso/SF}}$  became too high for spring in a boreal forest (Saurer et al., 2014; Tang et al., 2014). The influence of these high values was reduced by the  $\hat{A}$  correction, which accounts for the reduction in photosynthetic rates at low temperatures.

#### 4.2.3 | Sap flux estimate

Sap flux is a key variable in the  $\text{GPP}_{\text{iso/SF}}$  approach in order to obtain transpiration. Although the technique describes temporal variation well, its use for quantitative estimates requires accounting for several known sources of variation (Oren, Phillips, Katul, Ewers, & Pataki, 1998). Examples include sap flux trends radially in the stem (Cohen, Cohen, Cantuarias-Aviles, & Schiller, 2008; Ford, McGuire, Mitchell, & Teskey, 2004; Phillips, Oren, & Zimmermann, 1996; Renninger & Schäfer, 2012), azimuthally around the stem (Cohen et al., 2008; Oren et al., 1999), with tree size (Schäfer, Oren, & Tenhunen, 2000) and with local competition (Xiong et al., 2015). In addition, corrections are

required when probe length exceeds the sapwood depth (Clearwater, Meinzer, Andrade, Goldstein, & Holbrook, 1999). Finally, the probes often require specific calibration (Steppe, De Pauw, Doody, & Teskey, 2010; Sun, Aubrey, & Teskey, 2012). Some corrections have been proposed to reduce uncertainties from random variation (Peters et al., 2018; Steppe et al., 2010; Sun et al., 2012), yet some tree-to-tree variation remains (Oren et al., 1998). The model we used to estimate transpiration was carefully built to account for these errors. It resulted from a careful measurement design at stand scale.

Tor-Ngern et al. (2017) began with high quality data based on careful accounting for radial and azimuthal variations and baseline corrections. They recognized that the sensors were not specifically calibrated for *P. sylvestris*, but the values agreed well with previously reported results and were robust to the errors induced by the probes (Lundblad, Lagergren, & Lindroth, 2001; Poyatos et al., 2007). Likewise, the data were carefully scaled up to the stand using detailed descriptions of the allometric parameters and tree sizes (Ford et al., 2004; Oren et al., 1998). Because the sap flux/isotopic method is so dependent on quantitative sap flux data, other users must also ensure that their sap flux data remove any bias and are accurate as well as precise.

#### 4.2.4 | High variability of VPD impacts on $g_{c\hat{A}}$

There was considerable variation in our estimate of  $g_{c\hat{A}}$ . Because  $g_{c\hat{A}}$  was calculated as the ratio between transpiration and VPD, low VPD caused high variability and improbable  $g_{c\hat{A}}$  results [Equation (6)] (Ewers & Oren, 2000; Ewers, Oren, Johnsen, & Landsberg, 2001). This was especially true in the early and late growing season. The same phenomenon occurred sporadically during the thermal growing season. It forced us to apply a filter and to replace the inconsistent data inside the thermal growing season by predictions from a simple regression between  $g_c$  and  $\hat{A}$ . This filtering and replacement is a common procedure, especially at high latitudes where VPD is low (Emberson et al., 2000; Tarvainen et al., 2015). Although we are satisfied with this solution for the moment, a better means of dealing with low VPD should be sought. One promising possibility is to use  $\delta^{18}\text{O}$  to infer stomatal conductance under these conditions (Barbour, 2007); however, this requires that several ancillary measurements be made (Roden & Siegwolf, 2012).

#### 4.3 | Mesophyll conductance influenced $\text{GPP}_{\text{iso/SF}}$ estimates

The calculation of  $\text{WUE}_i$  would not have been valid if  $g_m$  had been considered infinite (Seibt et al., 2008; Wingate et al., 2007). Yet  $g_m$  is still frequently ignored by some global photosynthesis models and ecophysicologists (Hu et al., 2010; Rogers et al., 2017; Zhao et al., 2005), or is embedded within a constant empirical adjustment (Cernusak et al., 2013) most likely due to the challenges in its measurements (Flexas et al., 2008; Pons et al., 2009). Likewise, the global

modelling community has been reluctant to account for it because of the lack of consensus about how to measure or model it (Rogers, Medlyn, & Dukes, 2014).

We compared three different ways of accounting for  $g_m$ . Simplest would be to assume a constant mean value (Keenan, Sabate, & Gracia, 2010). For example, we estimated GPP with a constant  $g_m = 0.31 \text{ mol CO}_2 \text{ m}^{-2} \text{ s}^{-1}$  measured at the site (Stangl et al., 2019). The  $\text{GPP}_{\text{iso/SF}}$  from the assumptions of  $g_m = 0.31 \text{ mol CO}_2 \text{ m}^{-2} \text{ s}^{-1}$  was not different from the  $\text{GPP}_{\text{iso/SF}}$  from the  $g_{m\infty}$  assumption. Perhaps this is because the constant  $g_m$  value was estimated during sunny days in the summertime and therefore represents the maximal  $g_m$ , under optimal conditions.

We therefore based our comparison with PRELES on a constant ratio:  $g_m/g_{cA} = 2.67$ . The ratio has the advantage of allowing  $g_m$  to vary seasonally. Variation responds to environmental factors (Bickford, Hanson, & McDowell, 2010; Cano, López, & Warren, 2014; Han et al., 2016; Xiong, Douthe, & Flexas, 2018); both diurnal (Bickford et al., 2010; Peguero-Pina et al., 2017; Stangl et al., 2019) and seasonal (Montpied, Granier, & Dreyer, 2009) variations have been reported. The use of a constant  $g_m/g_{cA}$  ratio was certainly artificial (Xiong et al., 2018), but it is a relatively common assumption (Klein et al., 2016; Maseyk, Hemming, Angert, Leavitt, & Yakir, 2011). We suspect that the higher discrepancies between the  $\text{GPP}_{\text{iso/SF}}$  and  $\text{GPP}_{\text{PRELES}}$  in the fall and to a lesser extent in the spring occurred because the constant ratio did not adequately account for seasonal dynamics in  $g_m$ . The need to refine our description of  $g_m$  is confirmed by the uncertainty analysis (Table S1 and Figure S3) The Sobol indices, which describe sources of uncertainty, showed that almost 75% of the  $\text{GPP}_{\text{iso/SF}}$  uncertainty came from the  $g_m/g_{cA}$  estimate.

#### 4.4 | Difference between fertilization treatments

We found a slightly higher GPP in the fertilized plot than in the reference plots with the sap flux/isotopic method. Indeed,  $\text{WUE}_i$  in the F plot was higher than in the R plot, although  $g_{cA}$  was not different. This means that photosynthetic rates were higher on the F plot, as demonstrated in previous studies in coniferous boreal forest: photosynthetic activity, which is the product of  $g_s$  for  $\text{CO}_2$  and the  $[\text{CO}_2]$  gradient between the atmosphere and the sub-stomatal chamber ( $C_a - C_i$ ) increases only if the  $\text{CO}_2$  gradient increases for a given  $g_s$  value (Duursma & Marshall, 2006; Marshall & Linder, 2013).

The difference between the F and the R plots was only significant at the daily time scale, perhaps because of the large number of repeated measurements (Table 2, Figure S5). However, this sap flux/isotopic result, corrected for autocorrelation, was validated with the daily PRELES estimates (Table 2, Figure S5). However, it should be recognized that these daily estimates are not independent and may exaggerate our ability to detect a difference. In contrast, the annual sums did not detect a difference (Figure 5), perhaps because we were able to compare only 2 years, limiting the power of ANOVA. Thus, our annual sums did not find a significantly higher GPP in the F plot compared with the R plot, agreeing with previous studies focused on

photosynthetic activity at shoot (Tarvainen et al., 2016) and stand scale (Lim et al., 2015). The daily estimates did not agree. Based on these mixed results, we suggest that GPP under the F treatment might be slightly higher, but that a replicated study would be necessary to settle this question.

However, the magnitude of the GPP increase differed between PRELES and sap flux/isotopic methods. The 8% increase in  $\text{GPP}_{\text{iso/SF}}$  due to fertilization was nearest to Lim et al. (2015), who inferred a 3% difference in GPP between the same F plot and the R plot based on biometric measurements. In contrast, the  $\text{GPP}_{\text{PRELES}}$  value in the F plot was 16% higher than in the R plot, almost twice the increase estimated from  $\text{GPP}_{\text{iso/SF}}$  and five times higher than in Lim et al. (2015).

#### 4.5 | Role of understorey species

A key difference between the GPP methods is that  $\text{GPP}_{\text{iso/SF}}$  quantified GPP of the trees only, whereas  $\text{GPP}_{\text{PRELES}}$  quantified GPP of the whole ecosystem, which included understorey GPP. Understorey GPP was  $41 \text{ g C m}^{-2}$  in a 120-year-old Scots pine boreal forest (Kulmala et al., 2011) and 5% of the ecosystem GPP in mixed spruce-pine forest (Palmroth et al., 2019). PRELES estimated understorey GPP at our site to be 7 and 9% of the ecosystem GPP on the reference and the fertilized plots, respectively (Tian et al., in review). In other words, this preliminary estimate of fertilization treatment would induce 2% increase of understorey GPP. A direct comparison of tree GPP between the sap flux/isotopic and PRELES ( $\text{GPP}_{\text{PRELES}-7}$  and 9%) method would lead to 1,369 versus 1,194  $\text{g C m}^{-2} \text{ year}^{-1}$  in the R plot and 1,483 versus 1,248  $\text{g C m}^{-2} \text{ year}^{-1}$  in the F plot. However, this estimate needs more replicates to confirm the understorey contribution to global GPP. As these methods continue to improve, it may become possible to solve for understorey GPP by difference. Note that if a next study shows that the fertilization significantly increased understorey GPP, then  $\text{GPP}_{\text{iso/SF}}$  would not detect it, but  $\text{GPP}_{\text{PRELES}}$  would. Future work should explore this possibility.

### 5 | CONCLUSIONS

The  $\text{GPP}_{\text{iso/SF}}$  method provides an alternative empirical method to estimate forest stand GPP that is independent of EC. We compared  $\text{GPP}_{\text{iso/SF}}$  estimates from PRELES, a semi-empirical model parameterized with EC data. When annual means were compared across 2 years, the GPP estimates from the two methods were not significantly different. Moreover, the annual means showed no effect of the fertilizer treatment. However, when compared using daily estimates, the fertilized plot was 8% higher than the reference plot. The annual comparison agrees with previous estimates on this site, the daily comparison does not. Future work will continue to explore this question (e.g., Tian et al., in review). Adjusting  $\text{GPP}_{\text{iso/SF}}$  for  $g_m$  was necessary; we explored three alternatives for doing so. The inclusion of mesophyll conductance provides an empirical/mechanistic means of connecting isotopic measurements to gas-exchange measurements and

GPP<sub>iso/SF</sub> provides a means of scaling from individual trees to tree stands and canopies. Finally, a critical advantage of the sap flux/isotope based method for estimating GPP is that its requirements for the terrain and atmospheric conditions are less restrictive than for EC measurements. It can be applied in complex terrain, complex canopy structure and non-turbulent atmospheres.

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## AUTHOR CONTRIBUTIONS

J.D.M. and S.L. designed the experiment. J.D.M. and A.V. conceived the ideas and designed the methodology for the model comparison. P.T., M.P., and Z.R.S. collected the data. J.C. and M.P. analysed meteorological and EC data. R.O. and P.T. designed the transpiration model. J.D.M. and A.V. proposed the sap flux/isotope method and made the cross analyses of the different models. A.M. and X.T. provided PRELES estimates. Z.R.S. provided  $g_m$  data. A.V. and J.D.M. wrote the manuscript. All the authors contributed critically to the drafts and gave final approval for publication.

## CONFLICT OF INTEREST

The authors declare no potential conflict of interest.

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## SUPPORTING INFORMATION

Additional supporting information may be found online in the Supporting Information section at the end of this article.

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