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A fully integrated isoprenoid emissions model coupling emissions to photosynthetic characteristics

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Abstract

Recently, a biogenic isoprene emission model with improved CO_2 dependency was developed for global change applications (Morfopoulos et al., 2013). The model is based on the mechanistic linkage between isoprene emission and the availability of reducing power. Here, we advance the model formulation by introducing an explicit link between the electron transport (supply-constraint) and enzyme activity (capacity-constraint). We furthermore investigate the sensitivity of the model to variations in photosynthetic and emission-specific parameters. By comparing species-specific simulations with experimental data, we demonstrate that differences in photosynthetic characteristics can well explain inter-species differences in emissions. Interestingly, also the seasonal development emissions could be explained to some degree by the change of energy supply from photosynthesis throughout the season. In addition, we show that the principal responses are not limited to isoprene but can be formulated to describe the emission of all light-dependent volatile species. Thus, the model is a good candidate to be implemented in regional and global models that already provide species-specific photosynthesis estimates.

Keywords

Isoprenoid emission; biogenic emission modeling; photosynthetic electron transport; environmental sensitivity; model evaluation

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Introduction

Volatile organic compounds (VOCs) constitute an important component of air chemistry at all spatial and temporal scales. They encompass a rather large group of compounds, almost all of which contribute to air chemistry, for example through radical removal or ozone formation. Due to their effect on the concentration of ozone, the lifetime of methane, and the formation of secondary aerosols they also have a considerable indirect impact on climate (Aksoyoglu et al., 2012; Atkinson, 2000; Kulmala et al., 2013; Pike and Young, 2009).

Globally, it is estimated that about 90 % of VOC emission is attributed to vegetation (biogenic VOCs or BVOCs) (Guenther et al., 2012; Piccot et al., 1992). The components and emission pathways are diverse but they are dominated by isoprenoids that are either emitted from specific storage structures or from production sites in the leaf cells. The latter group includes constitutively produced molecules (i.e. products of the methyl-erythritol phosphate (MEP) pathway such as isoprene, monoterpenes, and methyl-butenol) as well as those that are only apparent under stress (i.e. sesquiterpenes and lipoxygenase (LOX) products, but also several stress-induced monoterpenes and homoterpenes (Li and Sharkey, 2013b; Niinemets et al., 2013)). However, some of these apparently induced molecules are likely to be produced at low level also during periods intervening stress events (Niinemets et al., 2013).

The amount of BVOCs emitted under future climate changes is of major concern (Arneth et al., 2010; Fowler et al., 2009; Laothawornkitkul et al., 2009; Park et al., 2013). BVOC emissions not only affect climate but they depend on climate and atmospheric chemistry conditions that are likely to change in the future: 1) BVOC emissions are exponentially linked to temperature over the physiological temperature range although at least isoprene has been found to be negatively correlated to CO₂ concentration (Grote et al., 2013; Li and Sharkey, 2013b). Thus, the impact of climate warming on BVOC emissions is potentially large but rather uncertain (Arneth et al., 2011; Keenan et al., 2009b; Monson et al., 2007); 2) Land-use change is supposed to shift species composition to higher emitters (Hardacre et al., 2013; Niinemets and Monson, 2013; Owen et al., 2013), in particularly many plant species used for bioenergy production are known to be high BVOC emitters (Ashworth et al., 2013b; Owen et al., 2013; Porter et al., 2012); 3) Emission control strategies will probably lead to a complex change in air chemical composition that may modify the impact of BVOCs on climate but may also directly affect plant physiology and thus BVOC emissions (Calfapietra et al., 2013; Hogrefe et al., 2011).

Despite the importance of the issue, current models simulating BVOC emission, in particular those BVOCs emitted directly after production (e.g. isoprene), still suffer deficiencies that bring into question their suitability for application in integrated climate-atmosphere models. What are these deficiencies?

One striking issue is that the many environmental controls on BVOCs emission (temperature, light, CO₂, drought, etc.) are assumed to act separately and independently. However, it is well known that light-dependent BVOC emissions are closely connected to photosynthesis (Grote et al., 2013; Grote and Niinemets, 2008; Monson et al., 2012;

Niinemets et al., 2002a; Niinemets et al., 1999), and an interdependency between CO_2 and light control (Sun et al., 2012), as well as CO_2 and temperature control (Rasulov et al., 2010; Sun et al., 2013) has been demonstrated. Thus it is apparent that BVOC emissions reflect to some degree environmental responses of the photosynthesis apparatus in addition to specific properties of the biochemical pathway involved, i.e. the MEP pathway (Li and Sharkey, 2013a; Li and Sharkey, 2013b; Magel et al., 2006; Rasulov et al., 2009; Velikova et al., 2011). Importantly, the relation between those two controls may change with changing environmental conditions, requiring the inclusion of an explicit mechanistic description of both process chains in BVOCs models.

Some models provide such an explicit description (Martin et al., 2000; Niinemets et al., 2002b; Niinemets et al., 1999; Zimmer et al., 2000). However, in coupled climate/chemistry simulations, BVOC emissions are mostly calculated with empirical relations linking emissions to a multitude of environmental conditions, but are independent of photosynthetic performance (Ashworth et al., 2013a; Guenther, 2013; Guenther et al., 2012; Kulmala et al., 2013; Poupkou et al., 2010; Simpson et al., 2012). There are two exceptions known to the authors (Pacifico et al., 2012; Unger et al., 2013) that use a modified version of the Niinemets model (Niinemets et al., 1999) linking isoprene emissions to photosynthesis by energy supply but nevertheless applying additional empirical functions, i.e. to account for CO₂, drought, and seasonal variation. Using such modifiers, however, may cause responses inconsistent with those of photosynthesis, in particular under unprecedented combinations of environmental conditions.

Given these important limitations, we argue that a generally applicable combined photosynthesis – emission model that consistently responds to various environmental conditions without the use of additional empirical response functions is needed. An outline for this approach has already been proposed (Harrison et al., 2013) and a model that calculates isoprene emissions based on a consistent linkage between photosynthesis and emission has been developed (Morfopoulos et al., 2013). Here, we advance this model in order to incorporate it into large-scale coupled climate / chemistry models, providing the first mechanistic isoprene emission model for global application based on the photosynthetic dependency of emissions.

Model Description

The model of Morfopolous et al. (2013) is based on energy-limited photosynthesis and energetic status. It particularly considers the available energy for secondary metabolism processes, i.e. the difference between the amount of energy that is provided by photosystem II (the protein complex in leaves that captures photons of light to provide the chemical energy needed for further synthesis) and that is used for carbon fixation. This information is provided by Farquhar-type photosynthesis models (Farquhar et al., 1980) although not all variants calculate all the necessary components explicitly. Here we use the simplified photosynthesis model of Collatz et al. (Collatz et al., 1991; Collatz et al., 1992) that is described in the appendix and is widely used in dynamic global vegetation models, for example in CLM (Dai et al., 2004), JULES (Clark et al., 2011), BETHY (also JSBACH) (Knorr and Heimann, 2001) and CTEM (Arora, 2003).

This model differs from the one suggested in Morfopoulos et al. (2013) in the way it considers the fraction of electron engaged in the MEP pathway due to photosynthesis (γ_{ph}) and enzyme activity (γ_{en}) which are calculated separately from the electron transport rate and temperature responses. These parameters are further normalized to standard conditions (of 30 °C and 1000 µmol m⁻² s⁻¹ photosynthetically active quantum flux density) to be scaled with the standard emission factor (emission under standard conditions) available for many species and plant functional types. The model can be formally stated as:

emission=RER
$$\times EF$$
 (Eq.1a)

$$\text{RER} = \gamma_{\text{ph}} / \gamma_{\text{ph}}$$
 norm $\times \gamma_{\text{en}} / \gamma_{\text{en}}$ norm (Eq. 1b)

yph norm photosynthetic emission potential normalized to standard conditions

 γ_{en_norm} enzymatic emission potential normalized to standard conditions

| EF | emission under standard conditions (30 $^{\circ}C$ and 1000 $\mu mol\ m^{-2}\ s^{-1}$ light, 365 ppm |
|----|--|
| | CO_2 air concentration) (µg g ⁻¹ DW h ⁻¹) |

RER relative emission response (-)

$$\gamma_{\rm ph} = [c_1 + c_2 \times \max\left(-\Delta J_{\rm MAX}, \mathbf{J} - \mathbf{J}_{\rm v}\right)] \times \mathbf{J} \times \min\left(1, \mathbf{C}_{\rm i}/\Gamma^*\right) \quad \text{(Eq. 2)}$$

| J | electron transport rate (μ mol m ⁻² s ⁻¹) |
|--------------------|---|
| $J_{\rm v}$ | electron flux required to support Rubisco-limited carbon assimilation (µmol $m^{-2}s^{-1})$ |
| Ci | intracellular CO ₂ (Pa) (see Equation A1 for derivation) |
| Γ^* | CO ₂ compensation point (Pa) |
| $J_{\rm MAX} = 30$ | maximum amount of electrons that can be supplied from other sources (µmol $m^{-2} \ s^{-1})$ |
| $c_{l} = 0.1765$ | share of energy used from excess electron transport (nmol isoprene μmol electron $^{-1})$ |
| $c_2 = 0.0028$ | basic fraction of energy supply from photosynthesis (nmol isoprene µmol electron ⁻¹² |

$$\gamma_{\rm en} = \exp\left(c_0 - \Delta H_{a_- en} / (R_G * tc)\right) / \left(1 + \exp\left(\left(\Delta S_{en} * tc - \Delta H_{d_- en}\right) / (R_G * tc)\right)\right) \quad (Eq. 3)$$

| T_c | temperature at the leaf surface (K) |
|----------------------|--|
| $c_0 = 32.86$ | scaling constant (J mol ⁻¹) |
| $H_{a_en} = 83129$ | activation energy of emission enzyme (J mol ⁻¹) |
| $H_{d_en} = 284600$ | deactivation energy of emission enzyme (J mol^{-1}) |
| $S_{en} = 887.5$ | entropy term of emission enzyme (J mol ^{-1} K ^{-1}) |
| $R_G = 8.314$ | $(J \text{ mol}^{-1} \cdot K^{-1})$ |

Parameters c_0 , H_{a_en} , H_{d_en} , and S_{en} are taken from Niinemets et al. (1999). The values for c_1 and c_2 were determined from observations of isoprene emission and photosynthesis of *Populus tremula* x *tremuloides* saplings (Sun et al., 2012). These data were used to:

1) evaluate the photosynthesis model with the species-specific parameters (see Table 2) except K_{C25} , and K_{O25} which were measured directly and V_{cmax25} which is estimated

iteratively to approach a simulation/ measurement relationship of 1 for the rubisco limited photosynthesis capacity A_C (see appendix). The resulting relationship between measured and simulated photosynthesis using the Collatz model is shown in Figure 1A;

2) derive emission model parameters from the relation between J- J_v and emission/J. The variables J and J_v have been calculated using the photosynthesis model described in the appendix with given environmental conditions as well as measured internal CO₂ concentration (C_i) and isoprene emission. The latter relationship gives the share of energy used from excess electron transport (parameter c_2 , slope in Figure 1B) as well as the basic energy supply (parameter c_1 , Y-axis interception in Figure 1B). Due to its dependency on J and Jv we refer to the new model JJv emission model.

More information about the measurements is available in Sun et al. (2012). It should be noted that the regression between emission and $[J-J_v]$ depend on the photosynthetic parameters and model formulation to derive J (including the formulation of J_{MAX} and the parameters E_{aJ} , θ , H_D and S_D).

The sensitivity of the simulated emission to environmental variables is shown in Figure 2. Note that the indication of the 'original' Niinemets differs from the formulation in Niinemets et al. (1999) in neglecting the C_i depending term that leads to a continuous rise of emission with increasing CO₂ concentration (Morfopoulos et al., 2013).

Additionally, we assumed that drought stress reduces the saturated rate of carboxylation (V_{cmax}) according to literature (Flexas and Medrano, 2002; Niinemets and Keenan, 2013; StPaul et al., 2012). This is important as V_{cmax} is an intermediate variable calculated to estimate energetic status (see appendix, Equation A9) and energy usage by photosynthesis (Equation B4). As a result of this drought stress dependent decrease in V_{cmax} , the lightdependent emission rate also declines under severe drought stress. A possible implementation of this mechanism has been proposed by (Keenan et al., 2009c; Keenan et al., 2010). This formulation (Equation 4) has been used for the current investigation of emission model sensitivity to environmental conditions. We note that the drought impact on V_{cmax} intentionally includes a parallel reduction of J_{max} (Equation B1), which has been reported on Mediterranean drought adapted species (Limousin et al., 2010; Vaz et al., 2010). However, since these two parameters may not always decrease in parallel, we introduced a specific parameterization for each process. We have also considered that drought affects stomatal conductivity and thus C_i according to the dependence of stomatal conductance on net assimilation rate, leading to an iterative loop between stomatal conductance, net assimilation rate and C_i (Ball et al., 1987). However, the effect of this process on the energy production is minor and is not discussed further. In addition, there may be a further reduction in photosynthesis due to photoinhibition (Werner et al., 2001) that is not considered.

 $\mathbf{V}_{\mathrm{CMAX}^{\prime}} = \mathbf{V}_{\mathrm{CMAX}} \times \min\left(1.0, rswc/R_L\right) \mathbf{\hat{E}}_{\mathrm{QV}} \quad \text{(Eq. 4a)}$

$$\mathbf{J}_{_{\mathrm{MAX}^{+}}} = \mathbf{J}_{_{\mathrm{MAX}}} \times \min\left(1.0, rswc/R_{_{L}}\right) \mathbf{\hat{E}}_{_{\mathrm{QJ}}} \quad \text{(Eq. 4b)}$$

| $V_{\text{CMAX}}\text{'}$ and $J_{\text{MAX}}\text{'}$ | altered Vcmax and Jmax under water stress conditions |
|--|--|
| Rswc | relative available soil water holding capacity (-) |
| $R_{L} = 0.6$ | limit value of relative soil water content below which $V_{\mbox{\scriptsize CMAX}}$ is affected |
| | (-), average of the range indicated by (Keenan et al., 2009a) |
| $E_{QV}=0.4$ | parameter to account for non-linear decline of $V_{\mbox{CMAX}}$ with drought increase, |
| | average of the range indicated by (Keenan et al., 2009a) |
| $E_{QJ} = 0.4$ | parameter to account for non-linear decline of $\boldsymbol{J}_{\text{MAX}}$ with drought increase |

Simulations

Model sensitivity to photosynthesis parameters

The proposed emission model is directly derived from foliage photosynthetic characteristics, and therefore, we expect the variations in the emission rate to reflect variations in photosynthetic parameters. Overall 13 parameters are used in the photosynthesis model and all of these are potentially species-dependent (Table 1, for equations see appendix). In many cases, only few investigations have determined these parameters experimentally, implying that the actual uncertainty range cannot be currently determined. However, the sensitivity of the electron transport chain – and thus BVOC emission – to variations of these parameters can be assessed by varying them across the observed range.

We analyzed simulated emissions under a range of values for 10 of these parameters with ranges defined by literature values (see Table 1). The remaining parameters (three Q10 dependencies of carboxylation, oxygenation and electron transport on temperature) are specific for the Collatz-model and assumed to be fixed. The analysis revealed that the most influential parameters on temperature, light and CO₂ sensitivity of emission are: Rubisco activity at 25 °C (V_{cmax25}) and the ratio between deactivation energy (H_D), and entropy (S) (Fig. 3). In addition temperature, light and CO₂ responses were also sensitive to activation energy (E_{aJ}), to the curvature parameter used to define the light dependency of electron production θ , and to the ratio between the potential rate of electron transport J_{max25} and V_{cmax25} at standard temperature (Q_{JV}) respectively.

It should be noted that the parameters affect the shape of the response curves in different ways. While the magnitude of the temperature response is determined by V_{cmax25} and E_{aJ} , optimum temperature shifts with H_D/S . The slope of the light response curve is affected by all the parameters mentioned above, but the start of emissions based on electron excess – which is apparent by the onset of a steeper slope – particularly depends on V_{cmax25} . Regarding the CO₂ response of emission, all parameters affect the steepness of the decline although in different directions. For example a small V_{cmax25} might be counterbalanced by a high J_{max25} .

Model sensitivity to emission parameters

The current parameterization of the parameters c_1 and c_2 is based on one dataset. As we cannot say how general or species-specific these parameters actually are, it is necessary to explore the sensitivity of the emission model to variations in these parameters. It should be noted that in Equation 1, the parameters c1 and c2 are used in fixed relation to each other, as:

$$\{ [c_1 + c_2 \times (\mathbf{J} - \mathbf{J}_{\mathbf{v}})] \times \mathbf{J} \} / \{ [c_1 + c_2 (\mathbf{J}_{30} - \mathbf{J}_{\mathbf{v}30})] \times \mathbf{J}_{30} \}$$

= $\{ [1 + \mathbf{rc} \times (\mathbf{J} - \mathbf{JV})] \times \mathbf{J} \} / \{ [1 + \mathbf{rc} (\mathbf{J}_{30} - \mathbf{J}_{\mathbf{v}30})] \times \mathbf{J}_{30} \}$ (Eq.5)

 $\begin{array}{ll} rc = c_2/c_1 \\ J_{30} & \mbox{electron transport rate for standard conditions (} \mu mol \ m^{-2} \ s^{-1}) \\ J_{v30} & \mbox{fraction of } J_j \ used for \ photosynthesis for standard conditions (} \mu mol \ m^{-2} \ s^{-1}) \end{array}$

Thus, we test the sensitivity of the model to this relation, rather than varying the absolute values.

From the very few datasets available in the literature, we analyzed a preliminary dataset from Morfopoulos et al. (submitted) examining emissions from *Populus nigra* seedlings and other from *Acacia nigrescens* (Possell and Hewitt, 2009). This resulted in c_2 ranging between 0.000004 and 0.003 and c_1 ranging between 0.003 and 0.18. Thus, values of rc ranging between 0.001 and approximately 0.02 were included in the sensitivity analysis.

Within the range of values tested, responses to light and temperature are not very sensitive to the selected parameters (Fig. 4). However, a wider range between the two parameters delays the light response of emissions similarly to high V_{cmax25} values, but retains the steep slope of the response. This indicates that a wider range than that tested should not be selected. In contrast, the response to increased atmospheric CO₂ concentration is quite sensitive to the shift in parameters, making it a suitable candidate for fine-tuning CO₂ responses when coordinated measurements of photosynthesis and emission are missing.

Model evaluation

Species specific emission responses

We evaluated the model using isoprene emission data from various sources collected by (Pacifico et al., 2009) for the tree species *Eucalyptus globulus* (eucalypt), *Liquidambar styraciflua* (sweetgum), *Populus tremula x P. tremuloides* (hybrid aspen), *Quercus rubra* (red oak) and *Q. robur* (pedunculate oak). Simulations are performed using specific photosynthesis parameters for each of these species with parameter values collected from the literature (Table 2). Note that specific photosynthetic parameters for each individual study as reported in Pacifico et al. (2009) were not available.

In Figure 5, species-specific environmental dependencies are presented together with measurement data of four tree species. Despite the large intra-species variation in the observations, which come from different sources, some basic differences between the species could clearly be explained by photosynthetic characteristics. The higher V_{cmax25} of sweetgum for example results in a steeper temperature response while its slightly higher temperature optimum can be attributed to its higher H_D/S_D relation compared to other species. The relatively small V_{cmax25} and high θ assumed for poplar is the reason for its higher emission sensitivity to radiation. A steeper decline of emission with increased CO₂ as observed in eucalypt and oak can be traced back to their higher V_{cmax25} and smaller Q_{JV} parameters.

Emission in different parts of the canopy

In order to investigate how leaf properties that change within the canopy profile affect the light dependent emission rate, we have additionally simulated photosynthesis and emission for the species *Quercus ilex* (holm oak) with two separate parameterizations for sun- and shade leaves. Therefore, we modified the standard parameters first (Table 1) to meet the general photosynthesis response as demonstrated in (Staudt et al., 2003). We used the lower end of values indicated in Table 1 for E_{aJ} , H_D and S_D and then sun and shade values for the parameters V_{cmax25} (sun: 90, shade: 60) and θ (sun: 0.5, shade: 0.7), which are known to vary with canopy depth (Niinemets et al., 2010b).

The comparison of measurements and simulation in Figure 6 shows that despite some deficiencies of the Farquhar/ Collatz model to capture the differences in photosynthetic temperature response for sun leaves (bottom left), the emission responses to temperature and light under sun- and shade conditions are quite well reflected (top panels). Again, the higher V_{cmax25} in sun leaves results in the shift to higher temperature optimum of emissions while the larger light curvature parameter θ in shade leaves is the reason for the steeper light response.

Seasonal emission changes

In addition to the immediate emission responses, the JJv model implicitly also accounts for seasonal dynamics because the amount of energy available for emissions depends on radiation and temperature and thus varies during the year. To demonstrate this, we have calculated monoterpene emissions using the sun-leaf parameters for Holm oak (see previous paragraph) and a constant scaling factor. The weather input is that of the year 2006 on an hourly basis from the EuroFlux eddy-covariance station at Puechabon, South France (Figure 7). At this site, the soil water supply gets very limited in summer. The simulation was run with (natural drought) and without (well watered) considering water limitation as calculated with a soil model specifically developed for this same site (Rambal, 1993). The simulations for the year 2006 have been evaluated with measurements. They decrease to 20 % of maximum soil water storage during summer (Grote et al., 2009). The drought impact on emission was calculated with Eq. 4 using an E_{QV} value of 0.7 for both V_{CMAX} and J_{MAX} modifications.

We compared the outcome with previous estimates of emission dynamics at the site in order to show the potential impact of seasonality and soil drought (Grote et al., 2009). These simulations were done with the SIM-BIM model for monoterpenes emissions which calculates seasonality dynamics considering synthesis and degradation of emission enzymes (Grote et al., 2006). Since it has been evaluated at the site we consider the simulation results of this model as standard here.

Figure 7 demonstrates that the seasonality of emissions is generally well met and the drought impact can be reflected by the proposed impact on photosynthesis. This is due to the cumulative response of electron transport rate (J) increasing in summer due to higher radiation and the immediate temperature response of enzyme activity. Nevertheless, the SIM-BIM model results are still somewhat higher than those obtained by the JJv model

during very warm summer conditions. Under realistic drought conditions, the differences between the two models became negligible.

Discussion

General responses

We presented a modification of a previously suggested emission model that is explicitly linked to photosynthesis by energy supply with a specific emphasis on excess energy. The new model formulation is limited by either the photosynthetic energy supply or by the enzymatic processing capacity. With the enzymatic temperature dependence empirically set, the temperature optimum of the whole emission response is well within the range of observations. The limitation by energy supply ensures a light-limited response under low-light condition and a saturation of emission levels under higher radiation regimes similar to the original Niinemets model (Niinemets et al., 1999). In addition, the newly introduced consideration of electron excess calculated from the supply rate by photosynthesis system II and the energy requirement of carbon assimilation in the Calvin cycle leads to a decreasing emission with increasing carbon assimilation relative to energy supply. Therefore, increasing CO_2 concentration leads to decreasing emission rates as has been frequently observed.

This way, environmental differences that affect photosynthesis also affect emissions in a consistent manner. For example, shade leaves have been shown to have smaller emission capacities that sun leaves which can be seen as a direct result of the photosynthetic adaptation (i.e. smaller V_{cmax25}). Our test with a dataset of (Staudt et al., 2003) indicated that this is the case and that further specification of emission parameters may not be necessary. This is particularly remarkable since this also shows that light-dependent emissions might be treated similarly, independent of the emitted chemical species (i.e. isoprene or monoterpenes).

Similarly, insufficient nutrient or water supply has been shown to affect photosynthesis as well as BVOC emission. However, the relationships are not easily determined. Fertilization and nitrogen supply state has mostly been reported as positively correlated with emission (Funk et al., 2006; Lerdau et al., 1997; Litvak et al., 1996) but also negative impacts have been observed (Ormeno et al., 2007; Van Wassenhove et al., 1990). This might be explained by the positive response of V_{cmax25} to nitrogen, leading to a higher electron supply (positive impact on emission) as well as to a higher electron consumption rate (negative impact on emission). The net impact on emission thus may depend on other species-specific or environmental boundary conditions.

A seasonal development of photosynthesis in the temperature regions is generally connected to the increase and decrease of radiation that determines the electron transport rate. Using this as a major determinant for isoprenoid emissions thus provides a mediating factor that is similar to the shape of empirical curves used to describe emissions empirically (Monson et al., 2012). This mechanism principally offers the possibility of a regionally adapted seasonal emission modification without the need of an additional empirical mechanism. However, it has to be shown, if this mechanism is generally capable to account for the full seasonal

effect. Comparison with other simulations presented here indicate that internal seasonality of enzyme capacity may still be important to consider.

Drought impacts have been observed to increase emission at least for mild drought conditions (Llusia et al., 2010; Šimpraga et al., 2011) and decrease them under more severe conditions (Grote et al., 2009; Wang et al., 2003). The decrease can be described considering a direct drought impact on V_{cmax25} and J_{max25} (Keenan et al., 2010), assuming that both are reduced in parallel. However, if on V_{CMAX} and J_{MAX} are differently affected (in other words Q_{JV} changes with drought) the JJv model offers an explanation for an emission increase with a temporarily increased electron supply. This may happen in the case where V_{CMAX} is temporarily more affected than J_{MAX} so that assimilation is reduced to higher degree than electron transport, leading to higher 'excess' energy in the plant cell (Figure 8).

Parameter sensitivity

We have shown that species-specific differences in emission response pattern are explained to a large degree by considering species-specific parameterization of photosynthesis. Particularly, a difference in V_{cmax25} , which is a parameter available for many species and is generally defined in most land-use models, directly influences the shape of the emission response curve for different light and CO₂ conditions. In addition, a species-specific set up of E_{aJ} , H_D , S, and θ - parameters that are often fixed for many if not all species or plant functional types – might have to be considered as species-specific. The suggested mechanism also emphasizes the need to investigate emission and photosynthesis together in order to test the hypothesis that both processes are linked together.

Besides a rigorous test of the linkage between photosynthesis and emission, we hope that the presented model assumptions are spurring research on the allocation of energy within the plant cell – and that this research can lead to further model improvements. The most urgent question in this respect is the generality of the c_1 , c_2 , and J_{MAX} parameters. From the investigation of another data set from Populus nigra (Morfopoulos et al., submitted) we have derived similar parameters but the species is also a similarly high isoprene emitter. In contrast, the parameters c_1 and c_2 were much lower for the low emitting species Acacia nigrescens (Possell and Hewitt, 2011). This may imply that mean that the parameters are linked to the emission capacity or to other species traits such as evergreen vs. deciduous. We have also to admit that the share of electron supply for emission is not described fully mechanistically but is directly derived from the data we used. From a physiological perspective the proposed mechanism might reflect the changes in the share of the pathway control between DMADP pool size and isoprene synthase activity, although evidence suggests that this is mainly a DMADP pool-size effect for CO₂ (Rasulov et al., 2010; Rasulov et al., 2011; Rasulov et al., 2009; Sun et al., 2012). From a modeling perspective, it would be more desirable to have a continuous decrease of electron supply when the J-Jv balance gets negative rather than a fixed threshold value. In this way, abrupt changes in the response pattern (i.e. light and CO₂ responses) could be avoided. However, current data do not support any further assumptions.

Outlook

Further developments and test are needed to assess the extent to which the model is effective for spatial and temporal upscaling. Depending on within-canopy responses and the response of whole leaf area growth to elevated [CO₂] whole-canopy response can significantly differ from single leaf responses (Sun et al., 2013). Applying the model results to the canopy scale requires evaluating whether the "canopy-response" function of isoprene emission can be reproduced (Grote et al., 2013; Niinemets et al., 2010a). Despite a certain degree of inherent seasonality that is linked to the difference in temperature and radiation development, additional consideration of seasonal enzymatic changes will be needed and possible seasonal adjustments of specific time periods such as flowering or senescence (Baghi et al., 2012), as well as induced emissions for example by air pollution (Vitale et al., 2008), are not at all covered. However, having established a physiological linkage between photosynthesis and emission paves the path for further development to implement a possible feedback loop that accounts for air pollution (i.e. ozone) damage and detoxification (Possell and Loreto, 2013; Rasulov et al., 2010).

With this outlook, the JJv model contributes to the discussion about the cause or function of (light dependent) BVOC emissions. It offers an explanation of how the intensively disputed emergency-valve theory (Owen and Peñuelas, 2005), which notes that excess energy is directed to the production of BVOCs, could be linked to evolutionary theories that state BVOCs are produced to detoxify dangerous reactive oxygen species formed under high light and temperature conditions.

Conclusion

We argue that emission models that are expected to explore future conditions need to consider both the adaptation of isoprene emission capacity to elevated atmospheric $[CO_2]$ and the modification in precursor availability (Sun et al., 2012). It is further important to account for the decrease in $[CO_2]$ -sensitivity of isoprene emission at higher temperatures (Li and Sharkey, 2013b; Rasulov et al., 2010; Sun et al., 2013). In this regards, the model applied here provides a very useful basis for linking emissions to photosynthesis that already considers the interactive influences of environmental drivers. However, the sensitivity of isoprene emission Especially challenging would be to gain insight into isoprene emission responses under heat stress. Under these conditions, the electron transport rate collapses (Hüve et al., 2011), but isoprene is emitted at a high rate, at least over a short term of a few minutes (Niinemets et al., 2010b; Singsaas et al., 1999; Singsaas and Sharkey, 1998; Sun et al., 2013). It is also important to note that heat stress responses of isoprene emission can be considerably altered by acclimation to elevated growth [CO₂] (Sun et al., 2013).

We suggest implementing the presented model into the land-surface models of regional and global models. As our preliminary analysis implies, this could be done on the basis of the implemented photosynthesis models without the need of additional parameters except emission scaling factors that are already used for specific vegetation types. The advantages would be that photosynthesis and emission would be consistently computed and that environmental responses would no longer depend on a multitude of empirical adjustments. It

can also be expected that emission responses would automatically benefit from a more pronounced differentiation of plant functional types. As BVOC emission capacity can vary more than an order of magnitude within a canopy, i.e. even more than the capacity of photosynthesis (Niinemets et al., 2010b) separate consideration of this variation might be warranted (Grote et al., 2013; Niinemets et al., 2010b). The introduction into Earth System Models of this new, mechanistic approach for the calculation of BVOC emissions can be expected to lead to more realistic simulations of the response of BVOC emissions to changing conditions of temperature, CO_2 concentration, and other environmental stresses expected under multiple future scenarios, and thus to a better representation of Earth System feedback processes involving these emissions.

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Appendix

A) Collatz et al. 1991 photosynthesis model (as implemented in the landuse model CLM, (Oleson et al., 2010), for all species-specific parameter values see Tables 1 and 2

$$C_i = co2 \times 0.7$$
 (Eq. A1)

 $I_{c} = par \times a_{L}$ (Eq.A2)

$${\rm K_{C}} = K_{C25} \times Q10_{KC} ((tc - T_{25})/10)$$
 (Eq. A3)

$$K_{O} = K_{O25} \times Q10_{KO} ((tc - T_{25})/10)$$
 (Eq.A4)

 $\mathbf{R}_{\rm D} \!=\! 0.015 \times \mathbf{V}_{\rm CMAX} * Q10_{\rm R} \stackrel{$}{} \left(\left(tc - T_{25} \right) / 10 \right) / \left(1 \! + \! exp \left(1.3 \times \left(tc - 308.15 \right) \right) \right. \text{ (Eq. A5)} \right)$

 $ft=1/\left(1+\exp\left(\left(-\Delta H_{D}+\Delta S_{D}\times tc\right)/\left(R_{G}\times tc\right)\right)\right) \quad (Eq.A6)$

 $V_{cMAX} = V_{cmax_{25}} * Q10_{VC} ((tc - T_{25})/10) \times ft$ (Eq. A7)

 $\Gamma^* = 0.5 \times \mathrm{K_C} \times o2 \times 0.21/\mathrm{K_O}$ (Eq.A8)

$$A_{\rm C} = V_{\rm CMAX} \times \left(C_{\rm i} - \Gamma^*\right) / \left(C_{\rm i} + K_{\rm C} \times (1 + o2/K_{\rm O})\right) \quad \text{(Eq. A9)}$$

$$A_{\rm E} = I_{\rm C} \times \alpha \times ({\rm C}_{\rm i} - {\rm \Gamma}^*) / ({\rm C}_{\rm i} + 2 \times {\rm \Gamma}^*) \quad ({\rm Eq}, {\rm A10})$$

$$A_{\rm S} = 0.5 \times {\rm V}_{{\rm CMAX}} \quad ({\rm Eq}, {\rm A11})$$

$$A_{\rm N} = \min \left({\rm A}_{\rm C}, {\rm A}_{\rm E}, {\rm A}_{\rm S} \right) - {\rm R}_{\rm D} \quad ({\rm Eq}, {\rm A12})$$

$$tc = {\rm temperature at the leaf surface ({\rm K})$$

$$par = {\rm photosynthetic active radiation (\mu {\rm mol m}^{-2} {\rm s}^{-1})$$

$$co2 = {\rm carbon dioxide concentration (\mu {\rm mol mol}^{-1})$$

$$o2 = {\rm carbon dioxide concentration (\mu {\rm mol mol}^{-1})$$

$$aL = {\rm radiation absorbance efficiency (see Tab.1)$$

$$a = {\rm quantum efficiency of photosystems (see Tab.1)$$

$$QI_{0KC} = 2.1 \quad {\rm Q10 factor for Rubisco carboxylation reaction (-)}$$

$$QI_{0KC} = 2.4 \quad {\rm Q10 factor for Rubisco carboxylation reaction (-)}$$

$$QI_{0KC} = 2.4 \quad {\rm Q10 factor for Rubisco axport response (-)}$$

$$I_{25} = 298.15 \quad {\rm standard reference temperature ({\rm K})}$$

$$R_{G} = 8.314 \quad {\rm general gas constant (J mol^{-1}{\rm K}^{-1})}$$

$$C_{\rm i} \quad {\rm intracellular CO_2 (\mu {\rm mol mol}^{-1})}$$

$$I_{\rm C} \quad {\rm absorbed photosynthetic active radiation (\mu {\rm mol m}^{-2} {\rm s}^{-1})}$$

$$K_{\rm O} \quad {\rm Michaelis-Menten constant for carboxylation ({\rm mol m}^{-1} {\rm ubar}^{-1})}$$

$$F_{\rm H} \quad {\rm temperature modification term (-)}$$

$$V_{\rm CMAX} \quad {\rm Rubisco capacity (\mu {\rm mol m}^{-1} {\rm m}^{-1})}$$

$$R_{\rm b} \quad {\rm photorespiration point ({\rm mol m}^{-1})}$$

$$A_{\rm c} \quad {\rm Rubisco limited photosynthesis capacity (\mu {\rm mol m}^{-2} {\rm s}^{-1})}$$

$$A_{\rm s} \quad {\rm export limited photosynthesis capacity (\mu {\rm mol m}^{-2} {\rm s}^{-1})}$$

 A_S net photosynthesis (µmol $m^{-2} \ s^{-1})$ $A_{\rm N}$

 $Q10_{KC} = 1$ $Q10_{KO} =$ $Q10_{KC} = 1$

 C_i $I_{\rm C}$

K_C Ko Ft V_{CMAX} Γ^* $R_{\rm D}$ A_C A_E

B) Electron transport and energy usage by photosynthesis (after von von Caemmerer et al. (2009) and Morfopolous et al. (2013))

$$\mathbf{J}_{\mathrm{MAX}} = Q_{JV} \times V_{CMAX25} \times \mathrm{ft} \times \exp\left(E_{aJ} + \left(tc - T_{25}\right) / \left(R_{G} \times T_{25} \times tc\right)\right) \quad (\text{Eq. B1})$$

$$J=\max\left(0,\left(I_{\rm C}+J_{\rm MAX}-\left(\left(I_{\rm C}+J_{\rm MAX}\right)\times\left(I_{\rm C}+J_{\rm MAX}\right)-4.0\times\theta\times I_{\rm C}\times J_{\rm MAX}\right)^{-0.5}\right)/\left(2.0\times\theta\right)\right) \quad \begin{array}{c} \text{(Eq. B2)} \\ \text{B2)} \\ \end{array}$$

$$K_{\rm M} = K_{\rm C} \times (1.0 + C_{\rm i}/K_{\rm O})$$
 (Eq. B3)

$$J_{\rm V}{=}4.0\times V_{\rm CMAX}\times \left(C_i{+}2.0\times\Gamma^*\right)/\left(C_i{+}K_{\rm M}\right) \quad \text{(Eq. B4)}$$

- J_{MAX} maximum electron transport rate (µmol m⁻² s⁻¹)
- J electron transport rate (μ mol m⁻² s⁻¹)
- J_V fraction of J used for photosynthesis (µmol m⁻² s⁻¹)
- K_M Michaelis-Menten coefficient

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Figure 2.

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Figure 3.







Figure 5.



Figure 6.



Figure 7.

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Figure 8.

Tab. 1

Parameters of photosynthesis model and uncertainty range that has been explored regarding its impact on the proposed emission model ('Ref' indicates the reference number for the values in the preceding columns as listed below the table)

| Parameter | Abbreviation | Units | Standard value | Ref | Range in literature | Ref |
|--|-------------------------|---|----------------|-----|---------------------|----------|
| Rubisco capacity at 25 °C | V _{cmax25} | μ mol m ⁻² s ⁻¹ | 60 | 1) | ~25 - 100 | 5), 6) |
| Michaelis-Menten constant for carboxylation at 25°C | <i>K</i> _{C25} | µmol mol ⁻¹ µbar ⁻¹ | 300 | 2) | 180 – 590 | 7), 8) |
| Michaelis-Menten constant for oxygenation at 25°C | K ₀₂₅ | mmol mol ^{−1} µbar [−] | 300000 | 2) | 160 - 420 | 9), 10) |
| Radiation absorbance efficiency | a_L | - | 0.86 | 2) | 0.86 - 0.895 | 2), 11) |
| Quantum efficiency of photosystems | а | mol mol ⁻¹ | 0.08 | 2) | 0.06 - 0.525 | 1), 12) |
| Deactivation energy of electron transport chain | H_D | J mol ⁻¹ | 220000 | 2) | 200000 - 220000 | 3), 2) |
| Enthropy parameter | S | J K ⁻¹ mol ⁻¹ | 703 | 2) | 645 - 710 | 3), 13) |
| Relation between maximum electron transport rate and Rubisco saturated rate of carboxylation at 25°C | Q_{JV} | - | 2 | 2) | ~1.5 - 3.0 | 14), 15) |
| Activation energy for electron transport | E _{aJ} | J mol ⁻¹ | 49884 | 3) | 28000 - 79500 | 16), 13) |
| Curvature parameter | θ | - | 0.7 | 4) | 0.5 - 0.95 | 17), 2) |

¹⁾(Oleson et al., 2010);

²⁾(Collatz et al., 1991);

³⁾(Kattge and Knorr, 2007);

4) (Evans, 1989)

⁵⁾(Grassi and Bagnaresi, 2001);

⁶⁾(Silim et al., 2010);

⁷⁾(Eichelmann et al., 2004);

⁸⁾{Rey, 1997 #12148};

⁹⁾(Wang et al., 2003);

10) (Harley and Baldocchi, 1995);

¹¹⁾(Medlyn et al., 2005);

12) (Harley et al., 1985);

13)(Farquhar et al., 1980);

14) (Harley et al., 1992);

15)_{(Urban et al., 2007);}

16) (Martin et al., 2000);

17) (Hirose et al., 1997)

Tab. 2

Species specific use of photosynthesis parameter for emission modeling ('Ref' denotes the reference column).

| Parameter | Units | Eucalypt | Ref | Sweetgum | Ref | Aspen | Ref | Red oak | Ref | Pedunculate oak | Ref |
|------------------------------------|---|----------|-----|----------|-----|--------|-----|---------|-----|-----------------|-----|
| V _{cmax25} | $\mu mol m^{-2} s^{-1}$ | 56.4 | 1) | 30 | 4) | 24.6 | 5) | 51 | 1) | 62 | 2) |
| K _{c25} | µmol mol ⁻¹ µbar ⁻¹ | 300 | ST | 300 | ST | 325 | 5*) | 300 | ST | 300 | ST |
| K ₀₂₅ | mmol mol ⁻¹ µbar ⁻¹ | 300000 | ST | 300000 | ST | 416000 | 5*) | 300000 | ST | 300000 | ST |
| K _{C25} /K _{O25} | | 1) | | 1) | | 0.8 | | 1) | | 1) | |
| H_D | J mol ⁻¹ | 200000 | 2) | 220000 | ST | 203000 | 6) | 200000 | 2*) | 200000 | 2) |
| S _D | $J K^{-1} mol^{-1}$ | 647 | 2) | 703 | ST | 651 | 6) | 641 | 2*) | 641 | 2) |
| H_D / S_D | | 309 | | 313 | | 312 | | 312 | | 312 | |
| Q_{JV} | - | 1.73 | 3) | 2.12 | 4) | 2.22 | 7) | 2.4 | 1) | 1.56 | 7) |
| E _{aJ} | J mol ⁻¹ | 43790 | 2) | 49884 | ST | 49884 | ST | 35870 | 2*) | 35870 | 2) |
| θ | - | 0.7 | ST | 0.7 | ST | 7) | ST | 0.7 | ST | 0.7 | ST |

¹⁾(Turnbull et al., 2002),

²⁾(Kattge and Knorr, 2007),

 (2^*) for Q. robur,

³⁾(Warren, 2004),

⁴⁾(DeLucia and Thomas, 2000),

⁵⁾(Sun et al., 2012),

5*) derived from Sun et al. (2012) data,

6) (Niinemets et al., 1999) for *P. tremula*,

⁷⁾(Garcia-Quijano et al., 2008), ST: standard assumptions (see Table 1)