Leaf phenology as one important driver of seasonal changes in isoprene emission in
 central Amazonia

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31 Abstract

32 Isoprene fluxes vary seasonally with changes in environmental factors (e.g., solar 33 radiation and temperature) and biological factors (e.g., leaf phenology). However, our 34 understanding of seasonal patterns of isoprene fluxes and associated mechanistic controls 35 are still limited, especially in Amazonian evergreen forests. In this paper, we aim to 36 connect intensive, field-based measurements of canopy isoprene flux over a central 37 Amazonian evergreen forest site, with meteorological observations and with tower 38 mounted camera leaf phenology to improve understanding of patterns and causes of 39 isoprene flux seasonality. Our results demonstrate that the highest isoprene emissions are 40 observed during the dry and dry-to-wet transition seasons, whereas the lowest emissions 41 were found during the wet-to-dry transition season. Our results also indicate that light and 42 temperature can not totally explain isoprene flux seasonality. Instead, the camera-derived 43 leaf area index (LAI) of recently mature leaf-age class (e.g. leaf ages of 3-5 months) exhibits the highest correlation with observed isoprene flux seasonality ($R^2=0.59$, 44 45 p < 0.05). Attempting to better represent leaf phenology in the Model of Emissions of

46 Gases and Aerosols from Nature (MEGAN 2.1), we improved the leaf age algorithm 47 utilizing results from the camera-derived leaf phenology that provided LAI categorized in 48 three different leaf ages. The model results show that the observations of age-dependent 49 isoprene emission capacity, in conjunction with camera-derived leaf age demography, 50 significantly improved simulations in terms of seasonal variations of isoprene fluxes 51 $(R^2=0.52, p<0.05)$. This study highlights the importance of accounting for differences in 52 isoprene emission capacity across canopy leaf age classes and of identifying forest 53 adaptive mechanisms that underlie seasonal variation of isoprene emissions in Amazonia.

54

55 1. Introduction

56 Isoprene is considered the dominant contribution to Biogenic Volatile Organic 57 Compound (BVOC) emission from many landscapes and represents the largest input to total global BVOC emission, which has the magnitude of 400-600 Tg C y^{-1} (see Table 1 58 59 of Arneth et al., 2008). This compound regulates large-scale biogeochemical cycles. For 60 example, once in the atmosphere, isoprene has implications for chemical and physical 61 processes due to its reactivity, influences on the atmospheric oxidative capacity, as well 62 as its potential to form secondary organic aerosols (Claeys et al., 2004), which interact 63 with solar radiation and act as effective cloud condensation nuclei. Moreover, isoprene 64 emissions could play an important role in the carbon balance, because it has the largest 65 contribution to total BVOCs, which are regarded as highly significant for net ecosystem 66 productivity, with their losses comparable to the magnitude of net biome productivity 67 (Kesselmeier et al., 2002); and carbon dioxide is believed to be the fate of almost half of 68 the carbon released in the form of BVOCs (Goldstein and Galbally, 2007).

Tropical forests are the largest source of isoprene for the atmosphere, contributing almost half of the estimated global annual isoprene emission, according to Model of Emissions of Gases and Aerosols from Nature (MEGAN) estimates (Guenther et al., 2006). Given that the Amazon basin is the largest territorial contribution to global tropical forests, this ecosystem is thought to be one of the most important sources of isoprene for the global atmosphere.

75 Recently, remotely sensed observations from multiple years have revealed 76 seasonal changes in isoprene emission over the Amazonian rainforest (Barkley et al., 77 2008, 2009, 2013, Bauwens et al., 2016). Apart from these remotely sensed data, only a 78 few studies based on in situ data exist (Alves et al., 2016; Andreae et al., 2002; 79 Kesselmeier et al., 2002; Kuhn et al., 2004b; Yáñez-Serrano et al., 2015). Some of these 80 *in situ* studies indicate that environmental factors such as solar radiation and temperature 81 are primary drivers of isoprene emissions (Andreae et al., 2002; Kesselmeier et al., 2002; 82 Kuhn et al., 2004b; Yáñez-Serrano et al., 2015).

83 However, besides long-term seasonal variation in light and temperature, other 84 biological factors might act on seasonal changes of isoprene emission, as in the case of 85 canopy phenology. Previous studies with temperate species have shown that isoprene 86 emission capacity is affected by leaf age and ontogeny (Kuzma and Fall, 1993; 87 Mayrhofer et al., 2005; Monson et al., 1994), because: (1) isoprene synthase and other 88 enzymes of isoprene synthesis pathway (MEP pathway) depends on the leaf ontogeny -89 isoprene synthase activity is low or absent in very young leaves, increases gradually until 90 full leaf maturation, and decreases with leaf senescence (Schnitzler et al., 1997); (2) for 91 species with non-senescent leaves, or with a life-span of more than one year, foliage

shading and time-dependent changes of physiological activity of leaves could decrease
isoprene emission capacity (Niinemets et al., 2004, 2010); and (3) leaf structure varies
with leaf ontogenetic stage, indicating that seasonal isoprene emission capacity is also
affected by seasonal structural changes in leaves (Niinemets et al., 2004, 2010).

96 Leaf phenology, with notable seasonal changes in the Amazonian rainforest, was 97 just recently discovered (Huete et al., 2006; Lopes et al., 2016; Myneni et al., 2007; 98 Saleska et al., 2016; Wagner et al., 2017), and there is still some debate about it (e.g. 99 Morton et al., 2014; Samanta et al., 2010). Given that for many years seasonal changes 100 and leaf phenology were thought to be unimportant for tropical forests, assumed to be in 101 an every even condition state, led the scientific modeling community to assume that leaf 102 phenology has little affect on forest and atmosphere gas exchanges in the tropics. 103 However, after remote sensing studies showed seasonal biomass changes (Myneni et al., 104 2007) and seasonal changes in isoprene emissions (Barkley et al., 2009, 2013), models 105 were improved in order to better represent seasonal biomass changes and leaf age in 106 tropical forests.

MEGAN already uses variations in LAI to parameterize changes in leaf age to stimulate changes in the emission activity factor of isoprene emission (Guenther et al., 2012). However, because leaf phenology in tropical forests is not as notable as in temperate forests, some insights on how changes in leaf age over the year may affect seasonal isoprene emissions are still missing, and there is a lack of representation of this process in models. Here, our goal is to demonstrate that leaf phenology affects seasonal changes of isoprene emission and this is, in fact, new information for tropical forests.

114 In this study, we present observations of seasonal variation of isoprene flux, solar 115 radiation, air temperature and canopy phenology from a primary rainforest site in central 116 Amazonia. The questions addressed are: (i) how much can seasonal isoprene fluxes be 117 explained by variations in solar radiation, temperature and leaf phenology, and (ii) how 118 can a consideration of leaf phenology observed in the field help to improve model 119 estimates of seasonal isoprene emissions. To this end, we correlate ground-based 120 isoprene flux measurements with environmental factors (light and temperature) and a 121 biological factor (leaf phenology). We compare seasonal ground-based isoprene flux 122 measurements to OMI satellite-derived isoprene flux. Lastly, we perform two simulations 123 with the MEGAN 2.1 to estimate isoprene fluxes: (1) with standard emission algorithms 124 and (2) with a modification in the leaf age algorithm derived from observed leaf 125 phenology.

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127 **2. Material and methods**

128 **2.1. Site Description - Cuieiras Biological Reserve – K34 site**

Isoprene fluxes were measured at the 53 m K34 tower (2°36' 32.6" S, 60° 12' 129 130 33.4" W) on the Cuieiras Biological Reserve plateau, a primary rainforest reserve 131 approximately 60 km northwest of Manaus in Amazonas state, Brazil (Fig. 1). The K34 132 tower has been widely utilized for the past 15 years for a range of meteorological studies, 133 including energy and trace gas fluxes (de Araújo et al., 2010; Artaxo et al., 2013; Tóta et 134 al., 2012) and also tropospheric variables such as precipitable water vapor (Adams et al., 135 2011, 2015). This reserve has an area of about 230 km² and is managed by the National 136 Institute for Amazonian Research (INPA). The site has a maximum altitude of 120 m and

137 the topography is characterized by 31% plateau, 26% slope and 43% valley (Rennó et al., 138 2008). The vegetation in this area is considered mature, *terra firme* rainforest, and with 139 typical canopy height of 30 m with variation (20-45 m) throughout the reserve. More 140 details about soils and vegetation at this site are provided in Alves et al. (2016). Annual 141 precipitation is about 2500 mm and is dominated by deep atmospheric convection and 142 associated stratiform precipitation, December to May being the wet season and August to 143 September the dry season, when the monthly cumulative precipitation is less than 100 144 mm (Adams et al., 2013; Machado et al., 2004). Average air temperature ranges between 145 24 °C (in April) and 27 °C (in September) (Alves et al., 2016).

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147 2.2. Isoprene flux – Relaxed Eddy Accumulation system (REA)

148 Isoprene flux measurements were conducted during intensive campaigns of five to six days, between the 20th and 30th of each month, during daytime (9:00-16:30, local 149 150 time), from June 2013 to December 2013 at the K34 tower. The REA system utilized for 151 the isoprene flux measurements was developed by the National Center for Atmospheric 152 Research (NCAR) NCAR/BEACHON REA Cassette Sampler), and has two basic 153 components: 1) the main REA box containing the adsorbent cartridges (stainless steel 154 tubes filled with Tenax TA and Carbograph 5 TD adsorbents) for up/down/neutral 155 reservoirs, microcontroller, battery, selection valves, and mass flow controller (200 ml 156 min⁻¹) (MKS Instruments Inc., Model M100B01852CS1BV); and (2) a Sonic 157 Anemometer (RM Young, Model 81000VRE) for high-rate wind velocity measurements 158 This REA system was installed at a height of 48 m on the K34 tower (10 Hz). 159 (approximately 20 m above the mean canopy height).

160 The technique segregated the sample flow according to sonic anemometer-derived 161 vertical wind velocity over the flux-averaging period (30 min). Isoprene fluxes (*F*) from 162 the REA system over this period were estimated from:

163
$$F = \overline{w'c'} = b\sigma_w(\overline{c_{up}} - \overline{c_{down}})$$
(1)

where *b* is an empirical proportionality coefficient (described below), σ_w is the standard deviation of *w*, and $\overline{c_{up}}$ and $\overline{c_{down}}$ are isoprene concentration averages in the up and down reservoirs, respectively (Bowling et al., 1998). The *b*-coefficient was calculated from the sonic temperature and heat flux by re-arranging the same equation, assuming scalar similarity (Monin-Obukhov Similarity Theory):

169
$$b = \frac{\overline{w'T'}}{\sigma_w(T_{up} - T_{down})}$$
(2)

170 The REA sampler was operated with a "deadband" - a range of small w' values, 171 centered on \overline{w} , over which the air was sampled through the "neutral" line. The deadband 172 used was $\pm 0.6\sigma_w$. The use of a deadband was advisable, because this increased the 173 differences in the measured concentrations $(\overline{c_{up}} - \overline{c_{down}})$ by sampling only larger eddies 174 (with larger concentration fluctuations) into the up/down reservoirs, reducing the 175 precision required for the analytical measurements. The *b*-coefficient was also computed 176 (from Eq. (2)) using the same deadband. For this study, the *b*-coefficient was calculated 177 for every 30 min. flux-sampling period. The *b*-coefficient averaged 0.40 ± 0.06 and the 178 flux measurements were filtered for *b*-coefficients in the range of 0.3 to 0.6.

The air sampling was carried out with two tubing lines for up (+w') and down (w') and one tubing line for neutral sampling air ($\pm 0.6\sigma_w$ - deadband), each consisting of approximately 1.5 m long tubes (polytetrafluoroethylene, PTFE) positioned such that they sampled air as close to the sonic anemometer as possible. Each inlet valve at the main REA box prevented air from entering the inactive tube (up- in the case of down sampling (-w') and down - in the case of up sampling (+w'), and both up and down in the case of deadband), which otherwise would compromise the concentration differences between up and down reservoirs and, consequently, the flux calculation.

187 The microcontroller recorded the sonic anemometer data and triggered the 188 segregation valves based on this data. The REA technique requires two initial data points 189 prior to each flux averaging period to be able to segregate the sample flow: (1) a mean 190 vertical wind velocity, \overline{w} and (2) σ_w . The \overline{w} determined the direction of the instantaneous vertical wind velocity $(w' = w(t) - \overline{w})$ and σ_w was required to calculate the deadband 191 192 threshold. Both the value of \overline{w} and σ_w were based on the values obtained from the last 193 flux-averaging period (30 min). The microcontroller stored all the necessary wind and 194 temperature information to compute all the parameters required in the equations (1) and 195 (2). More details on errors and uncertainties of the REA technique are found in section 1 196 (Supplementary Information).

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198 2.3. Isoprene concentrations

199 The isoprene accumulated in the adsorbent cartridges was determined from 200 laboratory analysis. The tube samples were analyzed with a thermal desorption system 201 (TD) (Markes International, UK) interfaced with a gas chromatograph/flame ionization 202 detector (GC-FID) (19091J-413 series, Agilent Technologies, USA). After loading a tube 203 in the ULTRA Automatic Sampler (Model Ultra1, Markes International, UK), which was 204 connected to the thermal desorption system, the collected samples were dried by purging 205 for 5 minutes with 50 sccm of ultra-high purity helium (all flow vented out of the split 206 vent) before being transferred (300°C for 10 min with 50 sccm of ultra-pure nitrogen) to

207 the thermal desorption cold trap held at -10 °C (Unity Series1, Markes International, UK). 208 During GC injection, the trap was heated to 300°C for 3 min while back flushing with 209 carrier gas (helium) at a flow rate of 6.0 sccm directed into the column (Agilent HP-5 5% 210 Phenyl Methyl Siloxane Capillary 30.0 m X 320 µm X 0.25 µm). The oven ramp 211 temperature was programmed with an initial hold of 6 min at 27 °C followed by an increase to 85 °C at 6 °C min⁻¹ followed by a hold at 200 °C for 6 min. The identification 212 213 of isoprene from samples was confirmed by comparison of retention time with a solution 214 of an authentic isoprene liquid standard in methanol (10 µg/ml in methanol, Sigma-215 Aldrich, USA). The GC-FID was calibrated to isoprene by injecting 0.0, 23, 35, and 47 216 nL of the gas standard into separate tubes. The gas standard is 99.9% of 500 ppb of 217 isoprene in nitrogen (Apel & Riemer Environmental Inc., USA) and was injected into 218 separate tubes at 11 ml min⁻¹. The calibration curve (0.0, 23, 35, and 47 nL) was made 219 thrice before the analysis of the sample tubes of each campaign, with a mean correlation 220 coefficient equal to $R^2=0.98$. In addition, two standard tubes (with 35 nL of isoprene) 221 were run at every 20 sample tubes to check the system sensitivity. The limit of detection 222 of isoprene was equal to 48.4 ppt. All tube samples were analyzed as described above 223 with the exception of tube samples from June 2013 and July 2013. These were analyzed 224 in a TD/GC-MS-FID system from the Atmospheric Chemistry Division, NCAR (see 225 section 1 of supplementary information for more details).

Isoprene concentration was determined using the sample volume that was passed through each tube. This volume was measured by integration of the mass flow meter signal and stored within the REA data file. While sampling, the concentration found in the blank tubes connected to the cartridge cassette in the REA box, but without flow, was

subtracted from the sample tube concentrations. The resulting concentration was used to calculate isoprene flux (Eq. (1)) in mg m⁻² h⁻¹.

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233 2.4. Tower-camera derived leaf phenology and demography

234 Upper canopy leaf phenology was monitored with Stardot RGB imaging system 235 (model Netcam XL 3MP) installed at 51 m height on the K34 tower (Lopes et al., 2016; 236 Nelson et al., 2014; Wu et al., 2016). The system used the native CMOS resolution of 237 1024 x 768 pixels and a varifocal lens (Stardot reference LEN-MV4510CS), adjusted to 238 about 66° HFOV. The camera was set to automatic exposure and did not apply automatic 239 color balance. The view was fixed with south azimuth toward a forested plateau area, 240 monitoring the same crowns over time and excluding the sky, so that auto-exposure was 241 based only on the forest. This system was locally controlled by a Compulab 242 microcomputer (model Fit-PC2i), which stored the images in situ. Images were 243 automatically logged every two minutes from 09:00h to 12:30h, local time. Only images 244 acquired near local noon and under overcast sky (having even diffuse illumination) were 245 analyzed. Images were selected at six-day intervals. The camera monitored upper crown 246 surfaces of 53 living trees over 24 months (1 December 2011 to 31 November 2013).

We used a camera-based tree inventory approach to monitor leaf phenology at this forest site (Lopes et al., 2016; Nelson et al., 2014; Wu et al., 2016). Specifically, we visually tracked the temporal trajectory of each tree crown, and assigned them into one of three classes: "leaf flushing" (crowns which showed a large abrupt greening), "leaf abscising" (crowns which showed large abrupt greying, which is the color of bare upper canopy branches) or "no change". We then aggregated our census to the monthly scale to

253 derive the monthly-average percentages of trees with new leaf flushing and with old leaf 254 abscission. The percentage of tree crowns with green leaves (1 - the percentage of tree)255 crowns with leaf abscission) is termed as "green crown fraction" (Wu et al., 2016). We 256 obtained a camera-based canopy LAI by applying the same linear relationship between 257 ground-measured LAI and camera-derived green crown fraction, fitted at another central 258 Amazon evergreen forest, the Tapajós K67 tower site (Wu et al., 2016). As the fraction of 259 all crowns classified to the abscised state has been shown to be linearly and inversely 260 proportional to total canopy LAI at seasonal timescales (Wu et al., 2016), it was used at 261 K34 to provide a camera-based estimate of temporal variation in canopy LAI.

We also estimated the monthly canopy leaf demography by tracking the post-leafflush age of each crown's leaf cohort and sorting them into three leaf age classes throughout the year (young: <=2 months; mature: 3-5 months; and old: >=6 months) (Nelson et al., 2014; Wu et al., 2016). By multiplying camera-derived total LAI by the camera-derived fraction of crowns in a given age class, LAIs were derived for the three leaf age classes: young leaf LAI, mature leaf LAI, and old leaf LAI.

268

269 2.5. Modeled isoprene flux estimates - MEGAN 2.1

Isoprene fluxes measured by REA (K34 site) were compared with those estimated by MEGAN 2.1. Isoprene emissions estimated by MEGAN 2.1 account for the main processes driving variations in emissions (Guenther et al., 2012). The isoprene flux activity factor for isoprene (γ_i) is proportional to emission response to light (γ_P), temperature (γ_T), leaf age (γ_A), soil moisture (γ_{SM}), leaf area index (LAI) and CO₂ inhibition (γ_{CO2}) according to Eq. (3):

276
$$\gamma_i = C_{CE} LAI \gamma_P \gamma_T \gamma_A \gamma_{SM} \gamma_{CO_2}$$
(3)

277 where C_{CE} is the canopy environment coefficient. For this study, the canopy environment model of Guenther et al. (2006) was used with a C_{CE} of 0.57. MEGAN 2.1 was run 278 279 accounting for variations in light, temperature, and LAI. Based on changes in LAI, the 280 model estimated foliage leaf age. Both CO₂ inhibition and soil moisture activity factors 281 were set equal to a constant of 1, assuming these parameters do not vary. In terms of soil 282 moisture, no seasonal variation in the model was assumed because a previous study 283 showed that during the dry season there is only a small reduction (~ 10 %) in soil moisture 284 compared to the wet season (Cuartas et al., 2012); and this reduction does not induce 285 water stress to this forest region (Wagner et al., 2017). Moreover, based on the dataset of 286 soil moisture shown from 2002 to 2006 (Cuartas et al., 2012), the soil moisture always 287 exceeds the threshold for the isoprene drought response in MEGAN 2.1 (Guenther et al., 2012), which means that MEGAN would predict that there are no variations in isoprene 288 289 emissions due to these observed changes in soil moisture. Details on model settings are 290 found in Guenther et al. (2012).

291 Photosynthetic photon flux density (PPFD) and air temperature inputs for all 292 model simulations were obtained from measurements at the K34 tower. PPFD and air 293 temperature measured at tower top, every 30 minutes, were hourly averaged. Data gaps 294 during certain months occurred in 2013, but at least 15 days of hourly average PPFD and 295 air temperature were obtained for model input. LAI inputs were acquired from the 296 Moderate Resolution Imaging Spectroradiometer (MODIS) satellite observations for the 297 same period of the isoprene flux measurements. The level-4 LAI product is composited 298 every 8 days at 1-km resolution on a sinusoidal grid (MCD15A2H) (Myneni, 2015).

Additionally, by comparison with the standard MEGAN 2.1 model that uses MODISderived LAI variation, here we also used LAI fractionated into different leaf ages, which were obtained from tower camera observations (as described in the section above). The number of data inputs to the MEGAN simulations is summarized in table 1.

303

304 **2.6. Satellite-derived isoprene flux estimates**

305 Top-down isoprene emission estimates over the 0.5 degree region around the tower were 306 obtained by applying a grid-based source inversion scheme (Stavrakou et al., 2009, 2015) 307 constrained by satellite formaldehyde (HCHO) columns, measured in the UV-visible by 308 the Ozone Monitoring Instrument (OMI) onboard the Aura satellite launched in 2004. 309 HCHO is a high yield intermediate product in the isoprene degradation process 310 (Stavrakou et al., 2014). The source inversion was performed using the global chemistry-311 transport model IMAGESv2 (Intermediate Model of Annual and Global Evolution of Species) at a resolution of $2^{\circ} \times 2.5^{\circ}$ and 40 vertical levels from the surface to the lower 312 313 stratosphere (Stavrakou et al., 2014, 2015). The a priori isoprene emission inventory was 314 taken from MEGAN-MOHYCAN (Stavrakou et al., 2014, http://emissions.aeronomie.be, 315 Bauwens et al. 2017). Given that the OMI overpass time is in the early afternoon (13:30, 316 local time), and the mostly delayed production of formaldehyde from isoprene oxidation, 317 the top-down emission estimates rely on the ability of MEGAN to simulate the diurnal 318 isoprene emission cycle and on the parameterization of chemical and physical processes 319 affecting isoprene and its degradation products in IMAGESv2. For this study, we use 320 daily (24 hours), mean satellite-derived isoprene emissions derived from January 2005 to

321 December 2013. More details can be found in Stavrakou et al. (2009, 2015) and322 Bauwens et al. (2016).

323

324 **3. Results**

325 The experimental site of this study showed seasonal variation in air temperature 326 and in photosynthetic active radiation (PAR) (Fig. 2a,b) that was comparable to the 327 seasonality presented by the OMI satellite-derived isoprene fluxes for the K34 site 328 domain (Fig. 2c). The interannual variation in the seasonality of these environmental 329 factors, air temperature and PAR, was correlated to the one presented by the satellite-330 derived isoprene fluxes, with the highest correlation found between satellite-derived isoprene fluxes and air temperature. Isoprene fluxes and PAR - R^2 ranged from 0.34 to 331 0.83 p<0.05; isoprene fluxes and air temperature - R^2 ranged from 0.61 to 0.91, p<0.01, 332 333 from 2005 to 2013. Maxima and minima of PAR, air temperature, and satellite-derived 334 isoprene fluxes were observed during the dry and the dry-to-wet transition seasons, and 335 the wet and the wet-to-dry transition seasons, respectively.

336 As opposed to the average (2005-2013) flux peaking in September, the 2013 337 results suggest a maximum in October, and are found to be substantially lower during the 338 2013 dry season compared to the average of the dry season estimates (reduction of \sim 31%) 339 (Fig. 2c). The timing of the maximum is not supported by the ground-based observations, 340 peaking in September, but the magnitude of flux estimates in these two months are in 341 good agreement. In the wet-to-dry transition period, the small reduction in satellite-based 342 isoprene fluxes in July 2013, compared to the neighboring months, is corroborated by a 343 similar behavior in the ground-based isoprene fluxes (Fig. 3d). However, the drop in the

observations is much stronger than in the top-down estimates (factor of 3 vs. a 70%difference).

346 Different from satellite-derived fluxes, ground-based isoprene fluxes measured 347 with the REA system have not shown significant correlation with PAR and air 348 temperature for the year 2013 (Table 2 and Fig. 3). Ground-based isoprene fluxes also 349 showed the maximum emission during the dry season (September), but emissions 350 remained high in the beginning of the wet season (December), which was not observed in 351 the seasonal behavior of PAR and air temperature. When averages of air temperature and 352 PAR measured only during the same days of REA isoprene flux measurements were 353 compared to isoprene fluxes, the correlations coefficients increased, but were still not 354 statically significant (Table 2).

355 The forest leaf quantity, shown as Leaf Area Index (LAI), varied little over the 356 year when the total LAI was examined. However, when total LAI was fractionated into 357 three different leaf age classes – young LAI (<=2 months), mature LAI (3-5 months), and 358 old LAI (>=6 months), seasonal variation of each age class appears (Fig. 4). To 359 understand how those LAI age fractions are related to the isoprene seasonality, ground-360 based fluxes of this compound were compared to the LAI age fractions estimated over the 361 entire year (Fig. 4). The highest emissions were observed when the number of trees with 362 mature leaves (mature LAI) was increasing and the number of trees with old leaves (old 363 LAI) was decreasing. Considering seasonal changes in PAR, air temperature, and mature 364 LAI, the latter presented the highest correlation coefficient, explaining 59% of the 365 seasonal isoprene emission variations (Table 2).

366 Isoprene flux simulations carried out with MEGAN 2.1 reveal similarities with the 367 magnitudes observed during several months. But, MEGAN 2.1 did not fully capture the 368 observed seasonal behavior (Fig. 5). Even though the leaf-age algorithm of MEGAN 2.1 369 was parameterized with local leaf phenology observations, giving the highest correlation 370 coefficient with observed fluxes (Table 2), isoprene flux simulations with local 371 CAMERA-LAI inputs showed only a reduction in isoprene flux magnitudes. The 372 seasonal behavior observed was the same as in the estimates from the default MEGAN 373 2.1 with MODIS-LAI inputs. Regressions between averages of observations and 374 MEGAN 2.1 estimates, with CAMERA-LAI and MODIS-LAI inputs, were weak and not 375 statistically significant (Table 2).

As a sensitivity test, observations of isoprene emission capacity at different leaf ages of a central Amazonian hyper-dominant tree species, *Eschweilera coriacea* (Alves et al., 2014), were used to parameterize the MEGAN 2.1 leaf age algorithm. Leaf level measurements of isoprene emission capacity are scarce in Amazonia. To the best of the authors' knowledge, Alves et al. (2014) are the only available data of leaf level isoprene emission capacity at different leaf ages of a central Amazonian tree species, which were therefore used for the MEGAN sensitivity test.

Further simulations were performed with modifications in the leaf age emission activity factor (EAF), which is dimensionless and is defined as the emission relative to the emission of mature leaves that are, by definition, set equal to one. A new EAF was assigned for each age class, based on observations of emissions of *E. coriacea* (Fig. 6). Leaf age fraction distribution was provided with input of LAI from MODIS (MODIS-LAI) and from LAI-derived field observations (CAMERA-LAI) (Fig. 4). The simulation

with the leaf age algorithm parameterized for EAF changes and with MODIS-LAI was similar to the one without changes in the EAF (MEGAN 2.1 default). The simulation with leaf age algorithm parameterized with changes in the EAF and with CAMERA-LAI inputs showed reduced emissions, but a seasonal curve closer to that of isoprene flux observed at K34 ($R^2 = 0.52$, p < 0.05) (Table 2).

394

395 **4. Discussion**

This study addressed two main questions with respect to the seasonality of isoprene fluxes in central Amazonia and identified possible limitations in our current understanding related to these questions.

4.1. How much can seasonal isoprene fluxes be explained by variations in solarradiation, temperature, and leaf phenology?

401 Our finding that isoprene emissions are higher during the warmer season is 402 consistent with previous findings that emissions from tropical tree species are light 403 dependent and stimulated by high temperatures (Alves et al., 2014; Harley et al., 2004; 404 Jardine et al., 2014; Kuhn et al., 2002, 2004a, 2004b). Indeed, satellite-derived isoprene fluxes (2005-2013 years) were well correlated to PAR and even more to air temperature 405 406 for all years. However, high ground-based isoprene emissions were observed until late of 407 dry-to-wet transition season, when mean PAR and air temperature were already 408 decreasing.

The reasons why satellite-derived isoprene fluxes are weakly correlated to ground-based isoprene fluxes can be attributed to either the difference in the studied scales (e.g., local effects could have major influences on ground-based isoprene fluxes)

and/or the uncertainties associated with the methodologies used to estimate or calculate 412 413 fluxes. The high correlation between satellite-based fluxes and air temperature or PAR is 414 not unexpected, because higher temperatures and solar radiation fluxes favor isoprene 415 emissions. Note however that the satellite-derived fluxes might also be subject to inherent 416 uncertainties, due to the existence of other HCHO sources, in particular biomass burning 417 (during the dry season) and methane oxidation. Since these latter contributions are 418 favored by high temperature and radiation levels, they could possibly contribute to the 419 high correlation found between satellite-based isoprene and meteorological variables.

For the ground-based emission, isoprene fluxes were determined by REA measurements that were carried out for six days per month. Therefore, the low correlation between ground-based isoprene fluxes and air temperature and PAR could partially result from limited qualified data.

424 Another factor correlated to ground-based isoprene fluxes is the leaf phenology 425 (in this study, LAI fractionated into age classes). The ground-based isoprene fluxes correlated better to variation of mature LAI than to other factors (K34 site $-R^2=59\%$, 426 427 p < 0.05), suggesting that the increasing isoprene emissions could partially follow the 428 increasing of mature leaves (Fig. 4). Wu et al. (2016) suggested that leaf demography 429 (canopy leaf age composition) and leaf ontogeny (age-dependent photosynthetic 430 efficiency) are the main reasons for the seasonal variation of the ecosystem 431 photosynthetic capacity in Amazonia. Photosynthesis supplies the carbon to the methyl 432 erythritol phosphate pathway to produce isoprene (Delwiche and Sharkey, 1993; Harley 433 et al., 1999; Lichtenthaler et al., 1997; Loreto and Sharkey, 1993; Rohmer, 2008; 434 Schwender et al., 1997), and isoprene emissions are strongly dependent on leaf

ontogenetic stage - due to the developmental patterns of isoprene synthase activity that
gradually increases with leaf maturation and decreases with leaf senescence (Alves et al.,
2014; Kuzma and Fall, 1993; Mayrhofer et al., 2005; Monson et al., 1994; Niinemets et
al., 2004, 2010; Schnitzler et al., 1997). Therefore, seasonal changes in the forest leaf-age
fractions may also influence the seasonality of isoprene emissions, suggesting higher
emissions in the presence of more mature leaves and during high ecosystem
photosynthetic capacity efficiency.

442 Understanding the correlations among light, temperature, leaf phenology (LAI 443 fractionated into age classes), and isoprene is not straightforward. The weak correlation 444 of seasonal changes between isoprene and light and temperature might be due to seasonal 445 changes in the isoprene dependency to environmental factors and biological factors. Light 446 and temperature peaked at the dry season; mature LAI, Gross Primary Productivity (GPP) 447 and photosynthetic capacity peaked at the wet season (Wu et al., 2016); and ground-448 based isoprene fluxes were high from the end of the dry to the dry-to-wet transition 449 seasons. This might suggest that isoprene emissions are stimulated by light and high 450 temperature during the beginning of the dry season and offset by the lower amount of 451 mature leaves. During the wet season, isoprene emissions could be stimulated by the 452 higher abundance of mature leaves and offset by the lower light availability and lower 453 temperature. But, at the end of the dry and at dry-to-wet transition seasons, there is a 454 combination of increased light and high temperature with a large amount of mature 455 leaves, possibly favoring high isoprene emissions.

This is supported by findings of a temperate plant species showing that LAI dependency (changes in leaf age) was the most important factor affecting isoprene

emission capacity, but when LAI decreased, and senescence started at the end of the summer, the isoprene dependency to PAR and air temperature was as high as the period when PAR and air temperature reached their maximum (Brilli et al., 2016). This shows seasonal variation in the strength of dependency to each factor that affects emissions.

462 As discussed above, separating the effects of changing temperature and light from 463 leaf phenology in canopy isoprene fluxes could allow for a more accurate quantification 464 and for a better understanding of seasonal isoprene flux. Here, we indicate that leaf 465 phenology plays an important role in seasonal variation of isoprene emissions, especially 466 because different leaf ages present different isoprene emission capacity and the 467 proportion of leaf age changes seasonally in Amazonia. However, when air temperature 468 is the highest, isoprene emission could be more stimulated by this factor, even though 469 mature LAI is still not at its maximum. We suggest future research to verify whether tree 470 species that present a regular seasonal leaf flushing are isoprene emitters and the strength 471 of those emissions by leaf age.

472

473 4.2. How can a consideration of leaf phenology observed in the field help to improve474 model estimates of seasonal isoprene emissions?

Modeling of isoprene emissions from the Amazonian rainforest has been carried out for around thirty years. The first models were simplified and parameterized with observations from a few short field campaigns (see Table 1 of Alves et al., 2016). With the increase in available data, more driving forces of isoprene emission were accounted for in the latest versions of models, as the case of the MEGAN 2.1, which has been improved with a multi-layer canopy model that accounts for light interception and leaf

temperature within the canopy, and includes changes in emissions due to leaf age that are
typically driven by satellite retrievals of LAI development (Guenther et al., 2012).

483 Results presented here are from MEGAN 2.1 estimates with local observations of 484 PAR, air temperature, and satellite-based leaf phenology. Initially, the default MEGAN 485 2.1 simulations did not fully capture the seasonal pattern of observed isoprene emission, with non-significant correlation between model estimates and observations ($R^2 = 0.16$, 486 487 P>0.05, Table 2). This could be due to the near saturation of LAI seasonality in 488 Amazonian evergreen forests and poor representation of leaf age effect on isoprene 489 emission capacity of tropical tree species in the default MEGAN 2.1. Furthermore, by 490 using the camera-derived LAI phenology and the leaf age demographics to update the 491 leaf age algorithm of the default MEGAN 2.1, we improved estimates of the proportion 492 of leaves in different leaf age categories for the site, but there were a lack of observations 493 for assigning the relative isoprene emission capacity for each age class.

494 It has been suggested that MEGAN uncertainties are mostly related to short-term 495 and long-term seasonality of the isoprene emission capacity (Niinemets et al., 2010). For 496 instance, for an Asian tropical forest, isoprene emission capacity was reported to be four 497 times lower than the default value of the MEGAN model (Langford et al., 2010), whereas 498 aircraft flux measurements in the Amazon were 35% higher than the MEGAN values (Gu 499 et al., 2017); and satellite retrievals suggested significantly lower isoprene emissions (30-500 40 % in Amazonia and northern Africa) with respect to the MEGAN-MOHYCAN 501 database (Bauwens et al., 2016). These all demonstrate that isoprene emission capacity is 502 not well represented in the model for regions where there are few or no measurements.

503 For a sensitivity test, we parameterized the MEGAN 2.1 leaf age algorithm with 504 observed isoprene emission capacity among different leaf ages of E. coriacea (Alves et 505 al., 2014). The resulting simulation showed that by knowing the leaf age class 506 distribution and the isoprene emission capacity for each age class, MEGAN 2.1 estimates 507 can be improved and better agree with observations in terms of seasonal behavior. To 508 date, there is very little information about isoprene emission capacity for different leaf 509 ages of Amazonian plant species (Alves et al., 2014; Kuhn et al., 2004a). The scarcity of 510 observational studies in the field, along with the huge biodiversity and heterogeneity of 511 the Amazonian ecosystems, creates a challenge to optimize the isoprene emission 512 capacity parameterization in MEGAN and other models. Therefore, while introducing 513 local seasonal changes of canopy leaf age fractions in the model should improve 514 estimates, seasonal variations in isoprene emission capacity also need to be characterized 515 to better represent the effects of leaf phenology on tropical ecosystem isoprene emissions.

516

517 **4.3. Possible limitations**

This study correlates available data of different scales and approaches. Thus, there are limitations that need to be considered. One is the uncertainty related to the method used to measure ground-based isoprene fluxes. The uncertainties of the REA flux measurements ranged from 27.1% to 44.9% (more details in section 1 of Supplementary Information). However, this study shows the largest dataset of seasonal isoprene fluxes in Amazonia presented to date and results presented here are similar to previous investigations, when the same seasons are compared (see Table 1 of Alves et al., 2016).

525 Another limitation is the uncertainty of MEGAN estimates. It has been shown that 526 models tend to agree with observations within ~30% for canopy scale studies with site-527 specific parameters (Lamb et al., 1996). Here, part of the low correlation between 528 observations and MEGAN 2.1 estimates is possibly due to short periods of measurements 529 and data gaps. There were data gaps of PAR and temperature for a few months in 2013. 530 This could influence the mean flux obtained from model estimates. Also, REA 531 measurements were carried out in intensive campaigns of six days per month, which may 532 not represent the flux for the entire month. Therefore, the limited data availability is still 533 challenging our understanding of isoprene emission seasonality.

534

535 5. Summary and Conclusions

536 To understand the pattern of isoprene seasonal fluxes in Amazonia is a difficult 537 task when considering the important role of Amazonian forests in accounting for global 538 BVOC and very limited field based observations in Amazonia. Seasonal variation of light 539 and temperature are thought to primarily drive isoprene seasonal emissions. However, 540 less notable factors in tropical forests might also influence ecosystem isoprene emission. 541 Here, we suggest that leaf phenology, especially when accounting for the effect of leaf 542 demography (canopy leaf age composition) and leaf ontogeny (age-dependent isoprene 543 emission capacity), has an important effect on seasonal changes of the ecosystem 544 isoprene emissions, which could play even more important role in regulating ecosystem 545 isoprene fluxes than light and temperature at seasonal timescale in tropical forests. To the 546 best of our knowledge, these results are the first to show the importance of leaf 547 phenology on seasonal isoprene emissions in a tropical forest.

548 Albeit there are uncertainties related to measurements and modeling, results 549 presented here suggested that the unknown isoprene emission capacity for the different 550 leaf age classes found in the forest may be the main reason why MEGAN 2.1 did not 551 represent well the observed seasonality of isoprene fluxes. Additionally, part of these 552 model uncertainties arises because of a lack of representations of canopy structure and 553 light interception, including within-canopy variation in leaf functional traits; the leaf 554 phenology within the canopy; the physical processes by which isoprene is transported 555 within and above the forest canopy; chemical reactions that can take place within the 556 canopy; and, the most difficult to assess, emission variation due to the huge biodiversity 557 in Amazonia. Therefore, more detailed measurements of source and sink processes are 558 encouraged to improve our understanding of the seasonality of isoprene emissions in 559 Amazonia, which will improve surface emission models and will subsequently lead to a 560 better predictive vision of atmospheric chemistry, biogeochemical cycles, and climate.

561

562 6. Data Availability

Even though the data are still not available in any public repository, the data are available upon request from the first author.

565

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884 Tables

885 Table 1: Environmental and biological factors used to input the MEGAN 2.1: number of 886 days with data available for each variable for the year 2013

e e e e e e e e e e e e e e e e e e e												
	Jan	Feb	Mar	Apr	May	Jun	Jul	Aug	Sep	Oct	Nov	Dec
PAR	<i>n</i> =31	<i>n</i> =28	<i>n</i> =31	<i>n</i> =30	<i>n</i> =31	<i>n</i> =30	<i>n</i> =31	<i>n</i> =15	<i>n</i> =30	<i>n</i> =18	<i>n</i> =19	<i>n</i> =15
Air	<i>n</i> =31	<i>n</i> =28	<i>n</i> =31	<i>n</i> =30	<i>n</i> =31	<i>n</i> =30	<i>n</i> =31	<i>n</i> =15	<i>n</i> =30	<i>n</i> =18	<i>n</i> =19	<i>n</i> =15
temperature												
CAMERA-	<i>n</i> =5	n=4	n=5	n=5	<i>n</i> =5	n=5						
LAI*												
MODIS-	n=4	n=4	n=4	<i>n</i> =3	n=5	n=4	n=4	n=4	n=4	<i>n</i> =3	n=4	n=4
LAI**												

887 Number of days with images analyzed to derive CAMERA-LAI as described in section 2.4.
888* Number of days that the satellite passed over the site domain.
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890 Table 2: Correlation coefficient, R^2 , of regressions for ground-based isoprene flux, 891 satellite-derived isoprene flux, environmental factors, biological factors, and

892 **MEGAN 2.1** simulations

	Ground-based isoprene flux	Satellite-derived isoprene flux (2013 year)
PAR	0.007 ^a	0.55°
PAR – REA measurement days	0.11 ^a	
Air temperature	0.15 ^a	0.79 ^c
Air temperature – REA measurement days	0.39 ^a	
young LAI	0.04 ^a	0.35 ^b
mature LAI	0.59 ^b	0.05 ^a
old LAI	-0.6 ^b	-0.4 ^b
Photosynthetic capacity*	0.49 ^a	
GPP*	0.36 ^a	
MEGAN (MODIS-LAI)	0.16 ^a	0.76 ^c
MEGAN (CAMERA-LAI)	0.11 ^a	0.67 ^c
MEGAN (MODIS-LAI) EAF changed	0.19 ^a	0.66 ^c
MEGAN (CAMERA-LAI) EAF changed	0.52 ^b	0.59 ^c
Ground-based isoprene flux		0.13 ^a

893 PAR, photosynthetic active radiation; GPP, gross primary productivity;

894 EAF, emission activity factor;

895 * Data from Wu *et al.* (2016)

896 ^a not statistically significant (P > 0.05)

897 ^b statistically significant (P < 0.05) 898 ^c statistically significant (P < 0.001)

899

900 Figure captions

Figure 1. Location of the experimental site in central Amazonia – K34 tower. Hillshaded digital elevation data used as background topography is from the Shuttle Radar
Topography Mission, with resolutions of ~900m (top panel) and ~30m (lower panel).
White ring indicates two km radius around the flux tower. Elevation scale for lower panel
is "meters above sea level".

906 Figure 2. (a) Monthly averages of photosynthetic active radiation (PAR) and (b) air

907 temperature from 2005 to 2013 at the K34 tower site (measured every 30 min during -

908 6:00-18:00h, local time). (c) OMI satellite-derived isoprene flux in a resolution of 0.5°

909 centered on K34 tower site from 2005 to 2013. Monthly averages of isoprene flux were

scaled to 10:00-14:00, local time. Error bars represent one standard error of the mean.

911 Figure 3. (a) Monthly cumulative precipitation given by the Tropical Rainfall Measuring

912 Mission (TRMM) for the K34 tower domain in 2013. (b) Monthly averages of PAR and

913 (c) air temperature, both measured every 30 minutes during 6:00-18:00h, local time, at

914 the K34 tower site in 2013. (d) Isoprene flux measured with the REA system at the K34

915 tower site in 2013; and OMI satellite-derived isoprene flux for the K34 tower region.

916 Figure 4. CAMERA-LAI derived for the K34 tower site. CAMERA-LAI data are 917 presented in three different leaf age classes: young LAI, mature LAI and old LAI. Error 918 bars represent one standard deviation from the mean. Background color shadings indicate 919 each season and are explicit in the legend. DWT season and WDT season stand for the

920 dry-to-wet transition season and the wet-to-dry transition season, respectively.

921	Figure 5: Isoprene flux observed (REA) and estimated with MEGAN 2.1 default mode,
922	leaf age algorithm driven by MODIS-LAI, and with MEGAN 2.1 leaf age algorithm
923	driven by CAMERA-LAI. EAF stands for emission activity factor, which was changed
924	for the different leaf age classes based on emissions of <i>E. coriacea</i> (Alves et al., 2014).
925	Figure 6. (a) Emission activity factor (EAF) of isoprene for each leaf age class assigned
926	in the default mode of MEGAN 2.1 proportional to leaf age class distribution derived
927	from field observations (CAMERA-LAI). (b) Isoprene EAF for each leaf age class,
928	obtained from leaf level measurements of the tree species E. coriacea, proportional to
929	leaf age class distribution derived from field observations (CAMERA-LAI). Observations
930	of the tree species E. coriacea (Alves et al., 2014) and CAMERA-LAI are both from the
931	K34 site.
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944 Figures



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969 Figure 4. CAMERA-LAI derived for the K34 tower site. CAMERA-LAI data are 970 presented in three different leaf age classes: young LAI, mature LAI and old LAI. Error 971 bars represent one standard deviation from the mean. Background color shadings indicate 972 each season and are explicit in the legend. DWT season and WDT season stand for the 973 dry-to-wet transition season and the wet-to-dry transition season, respectively.



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leaf age algorithm driven by MODIS-LAI, and with MEGAN 2.1 leaf age algorithm
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Figure 6. (a) Emission activity factor (EAF) of isoprene for each leaf age class assigned
in the default mode of MEGAN 2.1 proportional to leaf age class distribution derived
from field observations (CAMERA-LAI). (b) Isoprene EAF for each leaf age class,
obtained from leaf level measurements of the tree species *E. coriacea*, proportional to
leaf age class distribution derived from field observations (CAMERA-LAI). Observations
of the tree species *E. coriacea* (Alves *et al.*, 2014) and CAMERA-LAI are both from the
K34 site.