



# Stable carbon isotopic composition of biomass burning emissions – implications for estimating the contribution of C3 and C4 plants

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**Abstract.** Landscape fires are a significant contributor to atmospheric burdens of greenhouse gases and aerosols. Although many studies have looked at biomass burning products and their fate in the atmosphere, estimating and tracing atmospheric

- 15 pollution from landscape fires based on atmospheric measurements is challenging due to the large variability in fuel composition and burning conditions. Stable carbon isotopes in biomass burning (BB) emissions can be used to trace the contribution of C3 plants (e.g., trees or shrubs) and C4 plants (e.g. savanna grasses) to various combustion products. However, there are still many uncertainties regarding changes in isotopic composition (also known as fractionation) of the emitted carbon compared to the burnt fuel during the pyrolysis and combustion processes. To study BB isotope fractionation, we performed
- a series of laboratory fire experiments in which we burned pure C3 and C4 plants as well as mixtures of the two. Using isotope ratio mass spectrometry (IRMS), we measured stable carbon isotope signatures in the pre-fire fuels and post-fire residual char, as well as in the CO<sub>2</sub>, CO, CH<sub>4</sub>, organic carbon (OC), and elemental carbon (EC) emissions, which together constitute over 98% of the post-fire carbon. Our laboratory tests indicated substantial isotopic fractionation in combustion products compared to the fuel, which varied between the measured fire products. CO<sub>2</sub>, EC and residual char were the most reliable tracers of the
- fuel <sup>13</sup>C signature. CO in particular showed a distinct dependence on burning conditions; flaming emissions were enriched in <sup>13</sup>C compared to smouldering combustion emissions. For CH<sub>4</sub> and OC, the fractionation was opposite for C3 emissions (<sup>13</sup>C-enriched) and C4 emissions (<sup>13</sup>C-depleted). This indicates that while it is possible to distinguish between fires that were dominated by either C3 or C4 fuels using these tracers, it is more complicated to quantify their relative contribution to a mixed-fuel-fire based on the  $\delta^{13}$ C signature of emissions. Besides laboratory experiments, we sampled gases and carbonaceous
- 30 aerosols from prescribed fires in the Niassa special Reserve (NSR) in Mozambique, using an unmanned aerial system (UAS)mounted sampling set-up. We also provide a range of C3:C4 contributions to the fuel and measured the fuel isotopic signatures. While both OC and EC were useful tracers of the C3 to C4 fuel ratio in mixed fires in the lab, we found particularly OC to be depleted compared to the calculated fuel signal in the field experiments. This suggests that either our fuel measurements were





incomprehensive and underestimated the C3:C4 ratio in the field, or that other processes caused this depletion. Although additional field measurements are needed, our results indicate that C3 vs C4 source ratio estimation is possible with most BB products, albeit with varying uncertainty ranges.

# **1** Introduction

- 5 Biomass burning (BB) is an important source of carbonaceous trace gas- and aerosol emissions, affecting climate change and air quality. The savanna biome accounts for more than half of the global BB related carbon emissions (van der Werf et al., 2017). During pyrolysis and subsequent combustion, this emitted carbon is transformed into a large variety of chemical compounds (Andreae, 2019; Yokelson et al., 2013). Emission factors (EF) describe the amount of a compound that is emitted by burning a kilogram of dry biomass (g kg<sup>-1</sup>). EFs are known to vary with fire intensity, moisture content and type and structure of the vegetation (Chen et al., 2010; Urbanski, 2014; Yokelson et al., 1997). The modified combustion efficiency (MCE), calculated as ΔCO<sub>2</sub> / (ΔCO + ΔCO<sub>2</sub>) (molar emission ratio) (Ward and Radke, 1993), is an indicator of the completeness of the oxidation process and thus inversely correlated with the EF of reduced species like methane, non-methane
- 15 Measurements of atmospheric concentrations of BB emissions can teach us much about the importance of fire in the global carbon cycle, provided that EFs and atmospheric transport and chemistry are well understood. Bottom-up emission models use EFs, measured in fresh smoke, combined with satellite derived burned area and fuel loads to estimate global biomass burning emissions (van der Werf et al., 2017). Advances in satellite observations also allow us to directly measure atmospheric GHG and aerosol concentrations over BB regions and use this to estimate BB emissions and processes (e.g. Pechony et al., 2013;

hydrocarbons (NMHC) and organic particulate matter (PM) (Urbanski, 2013).

- 20 van der Velde et al., 2020; Zheng et al., 2018). So far, there are significant disparities between the temporal trends and emission ratios derived from bottom-up models (combined with atmospheric transport models), and the atmospheric concentration measured by satellites and fixed ground stations (Eck et al., 2013; Mao et al., 2014; Pechony et al., 2013). Isotopes may help to reconstruct the fate of BB emissions once airborne and shed light on the origin of these disparities (e.g. are discrepancies due to errors in bottom-up emissions or atmospheric chemistry related?).
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Relative abundances of stable isotopes in ecosystem components can be used to reconstruct ecological processes like photosynthesis and microbial decomposition (Zhu et al., 2019). The difference in the heavy-to-light isotope ratio of stable carbon isotopes ( ${}^{13}C$ : ${}^{12}C$ ) in a sample, compared to the standard 'Vienna Pee Dee Belemnite' (V-PDB) is referred to as  $\delta^{13}C$  and is reported in parts per thousand, or permille (‰). Plant  $\delta^{13}C$  composition is often linked to species and water use efficiency, as it relates to C3 and C4 photosynthetic pathways. As photosynthesis discriminates against heavy isotopes, plant material is  ${}^{13}C$ -depleted compared to the isotopic ratio in the atmospheric CO<sub>2</sub> (-7.8‰). The metabolism of C3 plants exhibits a stronger discrimination against heavier CO<sub>2</sub> compared to C4 plants, resulting in more depleted  $\delta^{13}C$  signatures ranging from



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roughly -30 to -25‰ vs -16 to -12‰ for C4 (O'Leary, 1988; Smith and Epstein, 1971). While C3 vegetation dominates the number of plant species, C4 vegetation, in particular savanna grass, is highly relevant for biomass burning because of the important role of savannas in global fire emissions. About 60% of photosynthesis occurring in savannas is attributable to grasses, ranging from 34% in central African woodland savannas to 84% in northern hemisphere neotropical grassland savannas (Lloyd et al., 2008). In African and Australian savannas, C3 and C4 photosynthetic pathways can roughly be used to differentiate between wood (trees or shrubs, C3) and grass (C4) vegetation classes (Boutton et al., 1999; Cachier et al., 1985; Lloyd et al., 2008; Swap et al., 2004; Wang et al., 2010; Wynn et al., 2020).

δ<sup>13</sup>C signatures of BB products are widely used in several scientific fields. Since the 1980s, stable carbon isotopes measured
in air pollution have been used to distinguish emissions from BB and other sources (Aguilera and Whigham, 2018; Andersson et al., 2020; Cachier et al., 1985; Gromov et al., 2017; Kawashima and Haneishi, 2012). Paleo-ecologists use pyrolyzed carbon signatures in soils to trace vegetation changes (Hall et al., 2008; Masi et al., 2013; Wynn et al., 2020). Isotopic signatures in BB emissions trapped in ice cores are used to reconstruct ancient fire regimes (e.g., Sapart et al., 2012). In many of these applications, the isotopic signature of the pyrolysis product is assumed to represent the signature of the precursor vegetation
(Gromov et al., 2017). In a fire, however, organic matter undergoes volatilization and oxidation during which isotopic fractionation takes place. Therefore, the stable isotope ratio in pyrolysis products is not only determined by the source fuel but also by fractionation during pyrolysis and subsequent processes like transport and atmospheric oxidation, meaning product

signatures may differ from the signature of the burnt fuel.

- 20 One cause of fractionation is related to the internal isotopic variability in the compounds that make up the fuel (Benner et al., 1987; Loader et al., 2003; Steinbeiss et al., 2006; Weigt et al., 2015; Wilson and Grinsted, 1977; Zech et al., 2014). Different parts of a single plant (e.g. leaves, stems and coarse woody debris) may differ isotopically as they are made up of various subcomponents with different enzymatic formation pathways. As combustion efficiency may vary for different plant parts (e.g. logs and leaves are known to burn following different EFs; Urbanski, 2014; Yokelson et al., 1997), these isotopic differences
- 25 perpetuate into the combustion products. BB kinetics are another source of fractionation. EFs are dependent on the phase and conditions of combustion and reactions may differ in <sup>13</sup>C and <sup>12</sup>C atoms. MCE and combustion temperatures are higher in quick-drying well-aerated grasses compared to more densely packed tree-litter (Hurst et al., 1994; van Leeuwen and van der Werf, 2011). The kinetic isotope effect (KIE) describes the difference in the rate of a chemical reaction when atoms in the reactants are replaced by their heavier or lighter isotopes (Atkins and De Paula, 2006). As vibrational frequencies are lower in
- 30 heavier atoms, a higher energetic input is required for heavier isotopes to react, and reaction rates tend to be slower. This may cause <sup>13</sup>C depletion in products arising from incomplete reactions. The isotopic fractionation of stable carbon from the fuel into different products during fires is affected by all these processes and not entirely understood.



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Many studies have reported some level of stable carbon isotope fractionation during biomass burning, often depending on the fire-phase and thus the temperature of combustion (Ballentine et al., 1998; Chanton et al., 2000; Kato et al., 1999; Stevens and Engelkemeir, 1988; Yamada et al., 2006). Since EFs are different for flaming combustion (FC) and residual smouldering combustion (RSC) (Andreae, 2019; Christian et al., 2003; Surawski et al., 2015), isotopic fractionation is not the same for all emission products. Previous studies identified isotopic carbon fractionation in EC (e.g. Bird and Ascough, 2012; Liu et al., 2014), char (e.g. Das et al., 2010; Liu et al., 2014), organic aerosol (Ballentine et al., 1998; Collister et al., 1994), non-methane hydrocarbons (NMHC) (e.g. Chanton et al., 2000; Czapiewski et al., 2002), CO<sub>2</sub> (Turekian et al., 1998), CO (Kato et al., 1999),

- CH<sub>4</sub> (e.g. Chanton et al., 2000; Umezawa et al., 2011), and the remaining biomass and pyrogenic soil organic carbon (SOC) (e.g. Santín et al., 2016; Turekian et al., 1998). However, all of the above-mentioned studies focus on a limited part of the BB
- 10 carbon balance. Following that the various isotopes are neither destroyed nor created during pyrolysis or combustion, the <sup>13</sup>C:<sup>12</sup>C ratio in the combined biomass burning products must equal the <sup>13</sup>C:<sup>12</sup>C ratio of the original fuel. We measured  $\delta^{13}$ C in CO<sub>2</sub>, CO, CH<sub>4</sub>, organic carbon (OC) and EC, which combined make up over 98% of the emitted carbon. Coupled with  $\delta^{13}$ C measurements from various fuel components and the post-fire residue (a combination of the unburned vegetation and non-emitted EC), we provide a comprehensive overview of the carbon mass-balance during pyrolysis.

# 15 2 Methods

This study comprises a series of laboratory experiments and prescribed fires, in which we sampled different carbonaceous BB emission species and measured their respective  $\delta^{13}$ C signatures. Under controlled laboratory conditions and during prescribed fires in the Niassa special reserve (NSR), Mozambique, we tested whether isotopic signatures in emission products resemble the signature of the fuel mixture. We calculated the isotopic fractionation ( $\epsilon$ ) following Eq. (1) (Jasper et al., 1994):

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$$\varepsilon = \left(\frac{1000 + \delta^{13}C_{product}}{1000 + \delta^{13}C_{Fuel}} - 1\right) \times 1000$$
 (1)

Where  $\varepsilon$  refers to the fractionation of the product compared to the precursor fuel and  $\delta^{13}$ C is given in permille; Positive fractionation means the product is enriched in heavy isotopes relative to the fuel. Table 1 lists the experiments and the measured species in the experiment.

# 25 2.1 Laboratory fire experiments

## 2.1.1 Experimental set-up

Controlled fire experiments were conducted in the Fire Laboratory of Amsterdam for Research in Ecology (FLARE, VU Amsterdam). The burning set-up consisted of an elevated, perforated metal platform holding the fuel. The fire was enclosed





in a reaction room with active ventilation through a chimney located at the highest point of the enclosure. Ambient air can enter from below and all emissions exit through the active ventilation shaft. The inlets for gas and aerosol sampling were positioned at the centre of the shaft.

## 2.1.2 Fuel compositions

- 5 We burned different fuel mixtures, consisting of C3 and C4 vegetation. For C3 vegetation, we used cherry logs (*Prunus avium*,  $\delta^{13}$ C of -26.8), oak shavings (*Quercus robur*, -25.7‰), and willow shavings (*Salix alba*, -29.0‰). For C4 vegetation, we used maize (*Zea mays*, -12.6‰) and prairie grass (*Schizachyrium scoparum*, -11.9‰). Roughly five hundred grams of fuel was combusted on the platform during each experiment. We used different fuel mixtures, ranging from 100% C3 to 100% C4 in 20%-intervals. Oak, willow, maize, and prairie grass had similar carbon contents of 44.5%, 43.2%, 42.0%, and 43.5%,
- 10 respectively. Table 2 lists the fuels used in the fire experiments, their fuel moisture content (FMC), the phases sampled and the measured products.

## 2.1.3 Laboratory combustion efficiency experiments

To study the effect of fuel conditions, we performed various rounds of experiments varying the moisture content and composition of the fuel (Table 2). To obtain wood with different moisture contents, untreated wood was soaked in water,
increasing the weight significantly. Fractions of soaked wood were then dried at 90°C for varying amounts of time and reweighed. For C4 grass, different moisture contents were obtained by drying the fresh cut grass at 60°C for 12 hours. We then took subsamples to determine the moisture content, carbon content and δ<sup>13</sup>C signature. Where possible, we sampled flaming (FL) and smouldering combustion (RSC) separately, albeit that for aerosols and residuals this was not always possible. In that case we measured the emissions from the total fire (TF) combined.

# 20 2.2 Field campaign

#### 2.2.1 Grassland and woodland savanna fires

Prescribed fires were measured in the Niassa special reserve (NSR), a protected area covering 42.000 km<sup>2</sup> in the Mozambican states of Niassa and Cabo Delgado. The area is affected by frequent (annual to biannual) fires, with an average fire return interval of 1.8 years, based on the MCD64A1 burned area dataset (Giglio et al., 2018), averaged over 2010-2019. The dominant

25 vegetation consists of dry Zambezian miombo woodland (Ribeiro et al., 2008), which is interspersed by seasonally flooded grasslands (dambo) in the research area. A more detailed description of the experiments and research location is provided by Russell-Smith et al. (2021). Fires were sampled in September and October of 2019, towards the end of the fire season. We measured the carbon isotopes in the fuel, residue and emitted particulates as well as the EFs of CO<sub>2</sub>, CO and CH<sub>4</sub> for 11 fires ranging from pure C4 grasslands to C3-dominated woodlands. Fires were lit between 12:00 and 14:00 in the afternoon and





extinguished naturally when humidity increased during the night or the fire reached fire-barriers (e.g. roads, early dry-season fire scars and riparian corridors).

# 2.3 Sampling and measurement methodology

#### 2.2.1 Gas sampling and analysis

- 5 In the FLARE (laboratory) experiments, a continuous sampling flow was directed from the chimney. Part of this flow was directly measured for CO<sub>2</sub>, CO, CH<sub>4</sub>, and N<sub>2</sub>O mixing ratios using cavity ring-down spectroscopy operating two different instruments: CO<sub>2</sub> and CH<sub>4</sub> concentrations were measured using a Los Gatos Research Microportable gas analyser and CO and N<sub>2</sub>O concentrations using an Aeris Technologies Pico series analyser. Additionally, we prepared fire- or fire phase-integrated gas samples for isotopic analysis of CO<sub>2</sub>, CO and CH<sub>4</sub>. For these subsamples, a fraction of the sample flow was diverted to a
- 10 10L Tedlar sample bag, either for a single combustion phase or for the total duration of the fire. Sampling was continued until CO levels dropped back to background conditions. After the experiment was finished, we transferred the sample from the 10L Tedlar bag through a magnesium perchlorate (Mg(ClO<sub>4</sub>)<sub>2</sub>) filled dryer and a 7-µm particulate filter into pressure-resistant 1L glass flasks (Normag®, Germany), which were covered with opaque rubber to block UV-radiation. We found that CO remains stable for a several months under these conditions.

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During the field experiments we filled single-polypropylene fitted Tedlar bags (SKC, type 232-01) with fresh smoke using a UAS-based (DJI, Matrice 200) sampling system. The UAS sampling methodology was described in detail in Vernooij et al. (2021). In short, we filled 1L Tedlar bags with fresh smoke at altitudes of roughly 15 meters over the fire. For each fire, we filled over 60 bags, covering the different phases of the fire. The samples were protected from UV, and analysed for  $CO_2$ , CO,  $CH_4$  and  $N_2O$  mixing ratios within 12 hours using the abovementioned equipment. Sample bags containing calibration gas

were interspersed with smoke samples during the analysis.

Background concentrations measured before the fire were subtracted from the smoke concentration to obtain the excess mixing ratio (EMR) of the respective gasses. We then calculated the EFs for CO<sub>2</sub>, CO and CH<sub>4</sub> following the carbon mass balance
approach (Ward and Radke, 1993), using the assumptions described in Vernooij et al. (2020); the carbon emitted as NMHCs and particulates (PM) was estimated based on previous savanna-based EF-studies listed by Andreae (2019); for NMHCs the carbon was assumed to be 3.5 times the carbon released as CH<sub>4</sub>. The total particulate-mass was assumed to be 7% of the CO emissions, with carbon representing 72% of the PM. For the field experiments, we split this particulate carbon based on the EC to OC ratio measured on the filters.

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The  $\delta^{13}$ C values of CO<sub>2</sub>, CO and CH<sub>4</sub> were measured at the Institute for Marine and Atmospheric Research (IMAU) in Utrecht, the Netherlands. CO and CO<sub>2</sub> were analysed using a continuous-flow isotope-ratio mass spectrometry (CF-IRMS) system,





specifically designed for measuring the isotopic compositions in both CO and CO<sub>2</sub> from atmospheric samples of a wide range of concentrations. An earlier version of the instrument is discussed in detail in Pathirana et al. (2015). The system is fitted with an inlet selection valve with sample loops of different volumes, which allows measuring samples with up to ~1% CO and ~16% CO<sub>2</sub>. The volume injected for each measurement was adjusted depending on the sample concentration.

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For the CO<sub>2</sub> isotope measurements, CO<sub>2</sub> was collected from the air sample in a cryogenic trap at liquid nitrogen temperature, further purified in a gas chromatographic column, and then directed to the mass spectrometer via an open split interface. The isotope ratios were calibrated using a set of five calibration gases (air in high pressure cylinders), with the  $\delta^{13}$ C values of CO<sub>2</sub> calibrated at MPI-BGC Jena (Assonov et al., 2020), and reported versus VPDB. For the CO measurements, first the CO<sub>2</sub> existing in the air sample is removed by an Ascarite (II) adsorbent; a subsequent liquid nitrogen trap removes the N<sub>2</sub>O and the

- 10 existing in the air sample is removed by an Ascarite (II) adsorbent; a subsequent liquid nitrogen trap removes the N<sub>2</sub>O and the remaining CO<sub>2</sub> traces. The CO in the sample is then oxidized to CO<sub>2</sub> using Schütze reagent. After this step, the analysis proceeds similar to the one for CO<sub>2</sub>, with the difference that all the CO<sub>2</sub> analysed in this case is derived from CO. The measurement is calibrated using a reference gas (high pressure air cylinder) with known CO isotopic composition, and reported versus VPDB. A "target" gas as well as additional gases with known composition and running blanks are measured regularly
- to check the stability of the system on long term. The typical precision, estimated as one standard deviation of the target measurement, was 0.2‰ for  $\delta^{13}$ C, for both CO and CO<sub>2</sub>

The isotopic composition of CH<sub>4</sub> (δ<sup>13</sup>C) was measured using the CF-IRMS based system described in Röckmann et al. (2016). In short, the CH<sub>4</sub> from the air sample is selectively collected in a Hayesep D trap cooled to -145°C; the trap is then warmed, and the released CH<sub>4</sub> is carried further in a He flow. For δ<sup>13</sup>C analysis, the CH<sub>4</sub> is directed to a combustion oven containing a Ni catalyst at 1100°C, where it is converted to CO<sub>2</sub> and H<sub>2</sub>O. The derived CO<sub>2</sub> contains all the carbon from the CH<sub>4</sub>, and carries its <sup>13</sup>C signature. The CO<sub>2</sub> is dried and further purified in a 10m PoraPLOT Q column (5°C), before entering the IRMS (Thermo Delta Plus XP) via a GasBench interface. The reported values are linked to the VPDB scale with a repeatability on the order of 0.1‰ for δ<sup>13</sup>C. We used Eq. (2) (Umezawa et al., 2011) to correct for the isotopic composition of the background CO<sub>2</sub>, CO, CH<sub>4</sub>, OC and BC:

$$\delta^{13}C_{smoke} = \frac{\delta^{13}C_{sample} \times C_{sample} - \delta^{13}C_{ambient} \times C_{ambient}}{C_{sample} - C_{ambient}}$$
(2)

## 2.2.2 Aerosol sampling and analysis

30 In both the laboratory and field experiments, aerosol samples were collected on pre-fired (800°C, 48h) 37mm quartz-fibre filters (Tissuquartz 2500QAT-UP, Merck). A flow-controlled pump (3 L min<sup>-1</sup>) was connected to an inertial impactor (Personal Modular Impactor, SKC) providing a cut-off of roughly 2.5µm before the air reaches the filter. During the laboratory





experiments, the filter was placed adjacent to the gas inlet in the centre of the actively ventilated chimney. Filters were replaced before each fire and in some experiments before the flaming and smouldering phases, separately. Blank filters were loaded for 5 minutes in between experiments.

- 5 During the field experiments, the flow-controlled filter sampler was mounted on the UAS in conjunction with the gas sampler. To minimize the effect of pressure distortions from the propeller blades on the aerosol composition, both the filter sampler and the gas inlet were attached to the end of a 1-meter boom extending out from the propeller airflow. The filter was employed during the full duration of sampling an individual fire (roughly 2-3 hours), during which the UAS transitions from background to smoky conditions several times. After that, we enveloped the filters in pre-treated aluminium foil (500°C, 48h) and sealed
- 10 them in airtight polyethylene bags. Samples were transported under cooled (<10°C) conditions to avoid evaporation of volatiles. During the experiments in Mozambique, blank filters were loaded for 5 minutes prior to the fire with ambient air at 15-meter altitude using the UAS.</p>

We analysed OC and EC on the quartz-fibre filters at the Centre for Isotope Research, Groningen University. OC and EC

- 15 quantities on the filter samples were determined using a thermal-optical analyser (Sunset Laboratory Inc.), according to the EUSAAR-2 protocol. The measurement setup and measurement protocol for stable carbon isotopes of OC and EC are described in detail by Yao et al. (2021) and Zenker et al. (2020). To stay within the systems' measurement range of 2-24 μg C, small segments of 0.13 to 3.00 cm<sup>2</sup> were punched from the filter samples. Samples with a TC loading of less than 2 μg C were not considered. For OC, δ<sup>13</sup>C was analysed for three volatility fractions using a 3-step thermal desorption protocol. For
- <sup>13</sup>C analysis of EC, we collected the CO<sub>2</sub> evolved after the OC/EC split point of the Eusaar2 protocol (Cavalli and Putaud, 2008). The  $\delta^{13}$ C values were measured with respect to an in-house reference gas ( $\delta^{13}$ C<sub>ref</sub> = -3.9‰ VPDB). The measurements were calibrated using 2-point linear scale correction based on two in house caffeine reference materials CAN (-3.9‰) and CAF (-38.2‰). The international reference material L-valine (-24.03‰) (Schimmelmann et al., 2016) was used as quality control. The measurement precision compared to the reference material was 0.18‰.
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In the literature, there is some ambiguity in the use of the terms elemental carbon, black carbon, ash, char and soot (Petzold et al., 2013). Therefore, we will clarify our definitions, which we also apply to the analysis of existing literature, further described in Section 4.1 to 4.3. EC in ash and EC in aerosols are treated separately as they are formed following different pathways. Char refers to the (still carbon rich) fraction that remains after the initial devolatilization. If char is combusted during smouldering

30 combustion, it leaves mineral-rich ash. As we did not separate unburned plant material, char and ash, it should be noted that the residual fraction comprises all three. The carbon content in this group ranged from 14 to 66% indicating a wide variability in the degree of decarbonisation within the residue.





# 2.2.3 Fuel load sampling and measurements

During the fieldwork campaign in Mozambique, we collected pre- and post-fire vegetation samples. Along randomized 50meter transects in the area selected to burn, we quantified fuels in six different classes: Trees, shrubs, grasses, heavy woody debris, coarse woody debris, and litter. The fuel measurements are described in detail by Eames et al. (2020). The fuel load for each fuel class was then calculated following Eq. (3). In addition to determining the fuel load of the respective classes, we

5 each fuel class was then calculated following Eq. (3). In addition to determining the fuel load of the respective classes, v collected representative subsamples to measure the moisture-, carbon and nitrogen contents as well as isotopic signatures.

$$FL_i = \overline{BM_i} \times \frac{1}{100 \times A_i} \times (1 - MC_i)$$
(3)

10 In which  $FL_i$  is the dry fuel load of class *i* in ton ha<sup>-1</sup>,  $\overline{BM_i}$  is the average biomass collected in the plots in g m<sup>-2</sup>,  $A_i$  is the area over which a single fuel sample is collected in m<sup>2</sup> and  $MC_i$  is the average moisture content as measured from the subsamples collected from the plot. For heavy debris, trees and shrubs we noted the count, diameter, height and fire consumption within a 10-meter distance from the transect. Except for shrubs, we found that these classes did not significantly contribute to the total fuel load on account of them largely remaining unaffected by the fire. For shrubs, we took separate subsamples for 'stems' and 'foliage' as the fire disproportionately consumed these classes.

At the Okavango Research Institute in Maun, Botswana, the subsamples were oven-dried for 48 hours at 70<sup>o</sup>C and grounded using a sample mill (Cyclotec 1093, Foss A/S). The samples were then analysed at the Vrije Universiteit Amsterdam where we pulverized the milled samples in a second milling phase using a high energy vibrational mill (MM 400, Retsch). After

- 20 drying the sample again for 24 hours, 4 mg of powder was analysed for nitrogen and carbon content (Flash EA 1112 series, Thermo electron corporation). In a second analysis using 0.4 mg, C and N stable isotopes were analysed using an elemental analyser (Flash NC 1112 series, Thermo electron corporation) coupled to an Isotope Ratio Mass Spectrometer (IRMS) (DeltaPlus XP, Thermo Finnigan). Two standards,: USGS40 (-26.39 ‰) and USGS41 (37.63 ‰) (Brand et al., 2014), were measured at the beginning of the run. A third official standard (USGS42, -21.09 ‰) was used as the control standard and was
- 25 interspersed through the whole measurement run. We then used a linear calibration to calculate the value of all samples and standards at a precision of <0.3‰. The weighted average  $\delta^{13}$ C of the combusted vegetation ( $\delta^{13}C_{fuel}$ ) was calculated using Eqs. 4 and 5:

$$C_i = FC_i \times FL_i \times CC_i \tag{4}$$

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$$\overline{\delta^{13}C_{fuel}} = \sum_{i=0}^{n} \frac{C_i}{C_{total}} \times \delta^{13}C_i$$
(5)





In Eq. (4) and (5),  $C_i$  is the total carbon emitted from fuel class *i*.  $FC_i$  is the carbon content of fuel class *i*,  $FL_i$  is the dry fuel load in tonne ha<sup>-1</sup>, and  $\delta^{13}C_i$  is the isotopic signature of the fuel class *i*.  $C_{total}$  is the total carbon consumed from the combined fuel classes.  $CC_i$  is the combustion completeness, measured as the difference between the pre- and post-fire fuel collections divided by the pre-fire fuel load of fuel class *i* (ratio). This ratio is calculated over the carbon present before and after samples to avoid the carbon mass balance bias from only measuring emissions (Surawski et al., 2016). As it was not possible to

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to avoid the carbon mass balance bias from only measuring emissions (Surawski et al., 2016). As it was not possible to distinguish residual carbon in litter and grass separately, these classes were pooled into one post-fire 'fine-fuel' class for the combustion completeness calculations.

#### **3 Results**

We describe our results in the following order. First, we quantify how carbon is converted to different BB products in our

10 laboratory experiments. We then interpret the isotopic fractionation in controlled laboratory fires and identify the main uncertainties in our measurements using the BB carbon balance. Finally, we describe the results of the measurements from the experimental field burns in the NSR.

## 3.1 Laboratory experiments

In a series of laboratory fire experiments with various fuel mixtures and combustion conditions, we tested (1) the relative partitioning of carbon into the reaction products, (2) how well these products retained the  $\delta^{13}$ C signature of the consumed fuel, (3) whether fractionation was different under different combustion conditions, and (4) whether we can close the isotopic budget of the fire.

## 3.1.1 EFs of burning products

For several pure-fuel and mixed-fuel fires, we separately assessed the BB products for the FC and RSC phases. Combustion 20 completeness was ~90% for the wood chip and ~95% for grass fires with >85% of the carbon being emitted during FC. While reduced species like CO, CH<sub>4</sub> and OC were more prevalent in RSC compared to FC, CO<sub>2</sub> was still the dominant post-fire carbon stock in RSC (>50%). Fig. 1 shows the post-fire partitioning of carbon in three laboratory fires using pure C3 wood chips, two fires using C4 grass and one fire using a 1:1 mixture.

25 The RSC emissions represented only a small fraction of the total carbon emissions (12-14%); this phase was responsible for only 9% of total CO<sub>2</sub> emissions and 10% of EC. However, RSC resulted in a substantial proportion of the CO (50%), CH<sub>4</sub> (41%) and OC (56%) emissions. For the C4 grass experiments the contribution of RSC was somewhat lower: CO<sub>2</sub> (10%), EC (9%), CO (34%), CH<sub>4</sub> (27%) and OC (36%), and the phase distinction was less clear from the emission ratios.



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# 3.1.2 $\delta^{13}$ C of burning products

We found evidence of fractionation relative to the substrate in most reaction products, albeit that some species were better tracers of the source fuel signature than others. Figure 2 gives an overview of the  $\delta^{13}$ C signatures measured in the fuel and the BB products from all laboratory experiments, including single fuels and mixtures regardless of combustion conditions. The regression slopes of EC, CH<sub>4</sub> and residual carbon (incl. char and ash) against precursor fuel closely matched the 1:1-line (difference < 10%). In CO, we found a high  $\delta^{13}$ C variability, mainly due to the large  $\delta^{13}$ C-range (-29.0 to -10.6 % VPDB) for C3 cherry logs. The CO slope was poorly defined and the mismatch was particularly high (RMSE > 4‰), indicating substantial uncertainty regarding the fractionation of carbon towards CO. These slopes may only be interpreted in terms of how closely each gas represents the fuel composition, there is no weighting by contribution included at this stage.

## 10 **3.1.3 Fractionation in flaming and smouldering emissions**

In accordance with previous studies we found that the isotopic fractionation was positively correlated with MCE for both  $CO_2$  and CO. Figure 3 presents the fractionation of the stable carbon isotopes ( $\epsilon$ ) measured in the laboratory experiments with controlled fuel compositions, as a function of the MCE. Save for OC, the regressions are calculated based on all data points. Experiments in which we separately sampled FC (typically high MCE) and RSC (typically lower MCE), are shown as circles and diamonds, respectively. If only the total fire emission was measured the value is shown as a triangle.

CO produced during FC was enriched in <sup>13</sup>C, and became depleted during RSC (Fig. 3a). In CO<sub>2</sub> (Fig. 3b) we found a similar pattern, but not as pronounced and more linear. This suggests that fuels consumed in flaming combustion consisted of heavier carbon (weighted average (WA)  $\varepsilon$  over all fuels and species of 0.21‰) compared to smouldering fuels (WA  $\varepsilon$  of -1.18‰). In Figs. 2 and 3, it should be noted that for mixed fuels ( $\delta^{13}C_{fuel}$  between -25 and -15‰), additional uncertainties arise from the

- Figs. 2 and 3, it should be noted that for mixed fuels ( $\delta^{13}C_{fuel}$  between -25 and -15‰), additional uncertainties arise from the fuel mixture and the dissimilar EFs, combustion rate and combustion completeness associated with (C4) grass and maize and (C3) wood chips. This may cause the latter to be overrepresented in the reduced species (i.e. CO, CH<sub>4</sub>, OC) as well as in the residue, whereas C4 grasses would dominate the flaming phase (i.e. CO<sub>2</sub>).
- For OC and CH<sub>4</sub>, we found opposite directions of fractionation for C3 and C4 vegetation, with the combustion products enriched in <sup>13</sup>C for C3 vegetation and depleted for C4 vegetation. As a consequence,  $\delta^{13}$ C signatures of CH<sub>4</sub> and OC emitted by the combustion of C3 and C4 plants are more similar than the signatures of the fuels. Our limited <sup>13</sup>C measurements on EC in smoke and the residual carbon fraction showed a slight 0-5‰ <sup>13</sup>C-depletion with no apparent correlation to fuel type or combustion efficiency. Overall, only the regressions for CO<sub>2</sub> and CO with MCE were statistically significant (p<0.05). This is
- 30 partly related to the larger number of samples; measurements of CH<sub>4</sub>, EC and the residual fuel were done for only a selected number of experiments. In pure-fuel experiments, carbon signatures in the residue were within 1‰ of the carbon signatures in





the fuel. In mixed-fuel experiments, the residue was typically more depleted compared to the weighted average fuel signature, indicating that C3 vegetation was over-represented in the residue (Fig. 2f).

## 3.1.4 The carbon balance

Although fractionation in the CO<sub>2</sub> carbon fraction was small ( $\varepsilon < 1\%$  on average), CO<sub>2</sub> represents the bulk (>75%) of the postfirst each on (Fig. 4a). Therefore, it contributes months the deviation of the WA most first S13C common data that of the post-

5 fire carbon (Fig. 4a). Therefore, it contributes most to the deviation of the WA post-fire  $\delta^{13}$ C compared to that of the precursor fuel (Fig. 4b). Note that the y-scale in Fig. 4a is interrupted to accentuate the smaller carbonaceous product fractions.

Fig. 4b presents the weighted average (WA) post-fire carbon, calculated as the stacked fractionation of the individual products weighted by the contribution of the respective product to the post-fire carbon budget. As the WA  $\delta^{13}$ C in the combined products

- 10 should match the fuel (no isotopes are destroyed nor produced), a larger deviation of the WA from 0 indicates a larger uncertainty. Although we did not measure the NMHC isotopic signature directly, previous studies found this fraction to be heavily <sup>13</sup>C-depleted. The hatched red bar in Fig. 4b represents the estimated weighted carbon fractionation in NMHC using 9.4‰ and -10.6‰ for C3 and C4 respectively, based on the average fractionation found by previous studies (Czapiewski et al., 2002; O'Malley et al., 1997; Rudolph et al., 1997; Yamada et al., 2009). The WA fractionation was on average slightly
- <sup>13</sup>C-enriched in C3 and slightly depleted in C4, albeit that over all the carbonaceous products combined, measured signatures deviated less than 0.75‰ from the original fuel (Fig. 4b). In the mixed fire 6, the <sup>13</sup>C-enrichment found in the products was compensated for by a <sup>13</sup>C-depletion in the residue (i.e. more C4 was combusted). What remains puzzling is that for C4 fires, both the products and the residual fraction were depleted.

## 3.2 Stable carbon characterisation in prescribed burning experiments in the NSR

20 Applying these measurements to savanna fires imposes several layers of additional complexity related to diverse fuel compositions, weather conditions, background interference, atmospheric chemistry and transport, and sampling challenges. Table 3 lists the carbon balance for the different vegetation types measured in the field campaigns in Mozambique (NSR).

#### 3.2.1 Fuel characterization

In Table 3, the pre-fire carbon was allocated to the fuel classes based on their respective pre-fire fuel load, combustion completeness and carbon content. On the Dambo grassland savanna plots, fires burned almost exclusively in grassy fuels, whereas in the woodland savanna plots in the NSR, the fuel ranged from being grass- to litter-dominated. Average moisture contents (as a percentage of wet weight) decreased from 23% to 14% for grass, and 14% vs 6% for litter between the EDS and LDS while the moisture content of coarse woody debris (CWD) remained roughly the same (7%). While the CWD contribution to the burned carbon in woodland savanna was only marginal in the early dry season (EDS), significantly more CWD burned

30 in the late dry season (LDS).  $\delta^{13}$ C for grasses were in line with C4 vegetation and  $\delta^{13}$ C signatures in litter, CWD and shrubs were in line with C3 vegetation.





# **3.2.2** Combustion products

EC fractionation behaved roughly similar in laboratory and field experiments, whereas OC fractionation was quite different. Figure 5 presents the  $\delta^{13}$ C signatures separately for the different OC volatility fractions and EC.

- For the laboratory experiments (Fig. 5a), the  $\delta^{13}$ C signatures measured in the overall PM<sub>2.5</sub> scaled well with the isotopic 5 composition of the fuel, considering that not all fuel necessarily burns completely and that EFs may vary significantly for the individual fuels of a mixture. For woodlands, EC depletion compared to the fuel was similar in the laboratory and field experiments, whereas EC from grasslands was much more depleted (mean  $\varepsilon$  of -6.8 ± 1.1‰) compared to laboratory grass fires (mean  $\varepsilon$  of -2.4 ± 1.9‰). All OC volatility fractions for the field experiments (mean  $\varepsilon$  of -6.6 ± 2.1‰) were more depleted relative to the fuel, than the laboratory measurements (mean  $\varepsilon$  of -0.2 ± 2.2‰).
- 10

Residual carbon signatures in the woodland experiments were close to C3 signatures, suggesting that the residue was C3dominated. However, we also found the residual fuel samples to be strongly depleted (by 4.5 to 5.5%) compared to the original C4 fuel in grassland experiments. We are confident that these grasslands consisted almost exclusively of C4 grass, which suggests an effect other than fuel mixture.

#### 15 4. Discussion

We will first relate our findings to the existing literature for the individual carbonaceous emissions. We then try to provide a comprehensive overview of stable carbon fractionation during biomass burning based on our data and previous literature combined. Finally, we will discuss the implications of our findings for the use of BB emissions as tracers of the combusted fuel mixture.

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The partitioning of emitted carbon into various species (BB products) in both the laboratory (Fig. 4) and field (Table 2) experiments was in agreement with literature averages for savanna fires: 95% CO<sub>2</sub>, 4% CO, 0.5% NMHC, 0.3% PM<sub>2.5</sub> and 0.2% CH<sub>4</sub> (Andreae, 2019), with emission ratios being dependent on vegetation type and fire phase (Andreae, 2019; Hoffa et al., 1999) Previous studies estimated residual EC (char and ash) to make up >90% of the total EC (Jones et al., 2019) and 4%

of the total burnt carbon (Surawski et al., 2016). Our residual fraction was substantially higher: 5-13% in the lab experiments and up to 30% in the field experiments, indicating that non-altered fuel likely dominated the residual fractions in C3 and mixedfuel experiments.

#### 4.1 Carbon fractionation in different reaction products

Fractionation exceeded the measurement uncertainties in most BB products, with in some cases significant differences between phases and vegetation types. Fig. 6 shows the stable carbon fractionation distribution of the measurements in this study





compared to previous biomass burning studies. In Figs. 6-8, values more than 1.5 times the interquartile range (IQR) above the upper or below the lower quartile are presented as outliers (diamonds). Whiskers represent the outermost values within 1.5 times the IQR of the respective quartiles. The literature data in these figures includes: CO (Kato et al., 1999), CO<sub>2</sub> (Turekian et al., 1998; Umezawa et al., 2011), CH<sub>4</sub> (Chanton et al., 2000; Snover et al., 2000; Stevens and Engelkemeir, 1988; Umezawa et al., 2011; Yamada et al., 2006), OC (Ballentine et al., 1998; Cachier et al., 1985; Czimczik et al., 2002; Garbaras et al.,

- t al., 2011; Yamada et al., 2006), OC (Ballentine et al., 1998; Cachier et al., 1985; Czimczik et al., 2002; Garbaras et al., 2015; Turekian et al., 1998), EC (Das et al., 2010; Liu et al., 2014a) and Char: (Ascough et al., 2008; Bird and Gröcke, 1997; Czimczik et al., 2002; Das et al., 2010; Jones and Chaloner, 1991; Leavitt et al., 1982; Liu et al., 2014a; Poole et al., 2002; Purakayastha et al., 2016; Turekian et al., 1998).
- 10 The fractionation towards CO<sub>2</sub> (-1.1 to +5.1‰) was consistent with measurements in Alaskan wildfires (Umezawa et al., 2011) and laboratory burning of C3 and C4 vegetation (Turekian et al., 1998). CO was significantly lighter during RSC (-2.3 to +4.0‰) compared to FC (+0.9 to +16.6‰). Although we found more <sup>13</sup>C-enriched CO emissions, our results are in agreement with those of Kato et al. (1999), who found that fractionation in CO from burning experiments in eucalyptus branches (C3) and maize (C4) was strongly related to the combustion phase. In our measurements CH<sub>4</sub> from RSC (-2.4 ± 2.4‰) was more
- depleted compared to FC ( $0.2 \pm 3.0\%$ ). Moreover, CH<sub>4</sub> from C4 grass samples was depleted ( $-4.3 \pm 1.4\%$ ), whereas CH<sub>4</sub> from C3 wood chips tended to be slightly enriched ( $0.9 \pm 1.1\%$ ). These results, as well as the overall average fractionation ( $-1.1 \pm 2.9\%$ ) were in line the fractionation described in previous studies ( $-1.1 \pm 4.6\%$ ) (Fig. 4). Stevens and Engelkemeir (1988) found little CH<sub>4</sub> fractionation for grass (+0.2%), pine (+1.3%) and Brush (-0.3%) fires when fuels were dry. In fresh brush fires however, carbon in the emitted CH<sub>4</sub> was significantly lighter (-7.9%) compared to the combined carbon in CO and CO<sub>2</sub>.
- 20 Umezawa et al. (2011) and Chanton et al. (2000) also reported significant phase differences in the fractionation of CH<sub>4</sub>, with <sup>13</sup>C-enriched flaming emissions and <sup>13</sup>C-depleted smouldering emissions in C3 fuels. In our measurements, CH<sub>4</sub> from C4 grass was significantly lighter, which corresponded with Chanton et al. (2000), who measured strongly depleted CH<sub>4</sub> emissions (-10‰) from RSC in Zambian savan na grasslands. Nonetheless, CH<sub>4</sub> emissions from other non-BB sources typically have much lower signatures (e.g. wetlands and rice paddies:  $-60 \pm 5\%$  VPDB, geological origins:  $-38 \pm 7\%$  VPDB and cattle:  $-68 \pm 3\%$
- 25 VPDB) (Chanton et al., 2000; Klevenhusen et al., 2009; Sapart et al., 2012). Although the relatively large depletion in C4 samples may thus complicate partitioning between C3 and C4 fuel, BB signatures remain isotopically distinct from those other sources.

OC Fractionation ranged from -0.3 to +3.0‰ in our laboratory measurements. While there was no significant difference between FC and RSC fractionation for OC, we found opposite directions of fractionation for emissions from C3 wood (<sup>13</sup>Cenriched) vs C4 grass (<sup>13</sup>C-depleted), which was in line with previous studies. The OC EF was inversely proportional to the MCE (Liu et al., 2014b; Pokhrel et al., 2016; Yokelson et al., 1997), meaning OC is predominantly emitted during RSC. For the prescribed fires, we found less volatile OC to be more depleted than more volatile OC, which is more often the case for





BB burning (Yao et al., 2022; Zenker et al., 2020). The conversion EC was relatively stable, though <sup>13</sup>C-depleted with average fractionation of  $-2.2 \pm 2.3\%$ , which was similar in FC and RSC emissions. Unlike OC, the EC EF is not strongly correlated with MCE. Combined with the decrease of OC emission factors with MCE, this causes the EC to TC ratio to increase exponentially (Liu et al., 2014b; Pokhrel et al., 2016; Yokelson et al., 1997). This was consistent with the ratio found in our filter measurements. EC emissions were more depleted in <sup>13</sup>C with respect to the precursor fuel for C4 compared to C3

- 5 filter measurements. EC emissions were more depleted in <sup>13</sup>C with respect to the precursor fuel for C4 compared to C3 vegetation. This was consistent with Das et al. (2010) who found no evidence of depletion or enrichment for C3 emitted EC, whereas for EC from C4 grasses they found a depletion in the range of -0.5 to -7.2‰. The average EC fractionation we found was slightly more depleted compared to previous studies.
- 10 With an average fractionation of  $-0.9 \pm 1.6\%$  we found the signature of the residual carbon to be close to the original fuel. While in some experiments non-chemically-altered fuel made up a significant portion of the residue, the small difference in  $\delta^{13}$ C between residue and fuel also held true for experiments in which the fuel was almost completely combusted and the residue appeared black indicating a high char content. This residual char could also be a good tracer for the combusted vegetation, and our residual fraction fractionation was in close alignment with the average fractionation for char found by
- 15 previous studies (-0.7  $\pm$  1.0‰).

While we did not measure the isotopic signatures of NMHC, previous studies may help to constrain the fractionation in this class, which was estimated to account for roughly 0.5-2.5% of the emitted carbon. NMHCs comprise myriad different compounds, and it is therefore not possible to find a common isotope signature for all NMHCs. O'Malley et al. (1997) found n-alkanes/alkenes to be depleted by 7.5-11.5‰ for C4 grasses and 3.9-5.5‰ for C3 wood. This depletion was also confirmed

20 n-alkanes/alkenes to be depleted by 7.5-11.5‰ for C4 grasses and 3.9-5.5‰ for C3 wood. This depletion was also confirmed by Czapiewski et al. (2002), with heavier molecules being more depleted. Yamada et al. (2009) found a strong relationship between isotopic fractionation in methanol and MCE, similar to our findings for CO. NMHC is predominantly emitted in RSC and EFs are inversely correlated to the MCE (Yokelson et al., 2013). The <sup>13</sup>C-depletion in literature confirms the overall phase differences we found in other RSC products like CO and CH<sub>4</sub>.

## 25 4.2 Isotopic distinction in biomass sub-components

Our results were in line with previous research focusing on individual emitted species. However, a major novelty of this study is that we measured almost all carbon-containing species. We will therefore now discuss the full carbon budget and the overall implications for BB carbon fractionation. Figure 7 shows the fractionation in the fuel sub-compounds compared to the bulk fuel (left) and burning products (right), based on our data, complemented by measurements reported in previous studies. For

30 studies that listed the MCE but not the combustion phase, we used an MCE threshold of 0.95 to partition the phases. Biomass consists of three main components: cellulose, hemicellulose and lignin, which respectively make up roughly 40 to 60 wt.%, 20 to 40 wt.%, and 10 to 25 wt.% of the dry bulk weight (McKendry, 2002). Pyrolysis of hemicellulose and cellulose is a rapid process, resulting in very low residue. Lignin on the other hand, pyrolyzes at a much slower rate and over a much wider





temperature range, generating a relatively large amount of char (~40 wt.%) (Yang et al., 2007). FC is dominated by cellulose decomposition, whereas RSC is driven by lignin pyrolysis and subsequent char combustion (Gani and Naruse, 2007). We know that both cellulose and hemicellulose are typically slightly isotopically enriched (1–2‰) compared to the  $\delta^{13}$ C in the bulk plant, whereas lignin tends to be depleted by 2–7‰ (Benner et al., 1987; Leavitt et al., 1982; Loader et al., 2003; Steinbeiss et al., 2006; Weigt et al., 2015; Wilson and Grinsted, 1977; Zech et al., 2014). Different combustion phases are dominated by the consumption of different fuel sub-compounds, and result in a different palette of combustion products (Sekimoto et al., 2018). We found CO<sub>2</sub>, CO, and CH<sub>4</sub> (representing >95% of the carbon emissions) to be heavier during FC than during RSC,

which coincides with a shift from cellulose and hemicellulose to lignin. The combustion efficiency is lower for lignin compared

to hemicellulose and cellulose, meaning more CO, CH<sub>4</sub> and PM are emitted by the former (Yang et al., 2002).

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Woody C3 fuels tend to be more lignin dominated compared to C4 grasses (Benner et al., 1987). The signature of the bulk material is thus shifted towards lignin in C3 wood, which may be why the signature of the lignin is less depleted compared to bulk (Fig. 5). In other words: If lignin is depleted by the same amount compared to hemicellulose and cellulose, but the lignin content is lower in C4 grasses, this would cause lignin, and subsequently lignin-derived BB products, to be more <sup>13</sup>C-depleted

15 compared to the bulk signature of those grasses. This coincides with our finding that RSC-emissions from C4 fires were more depleted with respect to the bulk-fuel signature compared to fires in C3 fuels.

## 4.3 The KIE and pyrolysis temperature

Temperature modulated charring experiments also indicate that carbon fractionation in both the charred fuel and the volatized fraction is strongly dependent on the charring temperature (Czimczik et al., 2002; Purakayastha et al., 2016; Song et al., 2012).

- 20 Kinetic fractionation would be most relevant at lower temperatures, where only some of the bonds pass the activation energy. As the activation energy for <sup>13</sup>C-<sup>12</sup>C is higher, relatively fewer of these bonds can be broken. At higher temperatures, the available energy is enough for any bond to be broken and the fractionation is expected to be lower. RSC is typically associated with much lower temperatures (500–700 °C) than FC (1500–1800 °C) (Rein, 2013; Rein et al., 2009), indicating isotopic selection from the KIE would be more significant. This may contribute to the more <sup>13</sup>C-depleted values we found in emissions
- 25 from RSC.

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# 4.4 Particulate carbon signatures from the field experiments

For the lab experiments OC was a decent indicator for the isotopic signature of the fuel. Although we found OC from the field samples to be depleted by  $-6.6 \pm 2.1\%$ , the signature was still strongly correlated to the initial fuel fraction. This may indicate that our fuel combustion measurements were underestimating the C3:C4 ratio of the consumed fuel. While this is not unthinkable, the observed depletion in EC compared to laboratory results was not proportionate to the C3:C4 fuel ratios found





in the plots. Contrarily, the difference was the largest for the C4-grasslands, for which we were confident that there was no significant C3 fuel.

Besides kinetic and sub-compound-based fractionation, the lower δ<sup>13</sup>C may be related to several reasons including (1) OC
being disproportionally more emitted by C3 (woody, RSC-prone) fuel with a lower δ<sup>13</sup>C signature (i.e. OC EFs vary for laboratory and field measurements), (2) condensation of semi-volatiles and quick chemical reactions occurring in the ambient plume which did not happen in the dark lab chimney or (3) underestimation of the background OC in the field plots. Any of these explanations would require the behaviour in the field to significantly differ from the laboratory fires in mixed fuels, in which we did not find this depletion. Previous studies on isotopic fractionation of BB products are almost exclusively

10 performed under laboratory conditions. Additional isotopic measurements from landscape fires are necessary to explain the discrepancy in our laboratory and field results.

# 4.5 $\delta^{13}C$ as an indicator for fuel sources

Figure 8 shows the  $\delta^{13}$ C signature of C3, C4 and mixed fuels (left) as well as the signatures for various BB products (right) derived from this study, complemented with previous literature. While these literature studies also include experiments in non-

- 15 savanna fuels, the  $\delta^{13}$ C signatures we found for savanna grasses and trees were in line with those of C3 and C4 vegetation. For CO, CH<sub>4</sub>, OC, and to a lesser extent EC, fractionation led to the convergence of C3 and C4 isotopic signatures, complicating fuel source appointment. Uncertainty remains particularly large in CO and CH<sub>4</sub> which may affect the interpretation of historic fire regimes using gas trapped in ice cores (e.g. Wang et al., 2010, Ferretti et al., 2005). CO<sub>2</sub>, EC and char retained the isotopic signature of the precursor plant mixture well. They are thus suitable to identify fuel sources. This contrasts with OC and CH<sub>4</sub>,
- 20 for which differences in fractionation between C3 and C4 plants and fire phase, combined with the high uncertainties complicates the source allocation of smoke from mixed vegetation.

While CO measurements showed significant variability, this was primarily the result of high-MCE (therefore low CO concentration) measurements. This small amount of highly enriched CO may therefore become insignificant in the overall signature of a mixed smoke plume, meaning that the bulk CO signature will be much closer to the signature of the burned fuel.

## 25 **4.6 Uncertainties**

## 4.6.1 Carbon from other sources

While the carbon pools we measured should be almost comprehensive in a closed system, field experiments like the ones conducted here are not closed systems. Cachier et al. (1995) proposed that aeolian erosion resulting from the thermal updraft over the fire can cause a significant atmospheric influx of fine biogenic particles from the soil. These particles can originate

30 from far away, or from older vegetation and thus do not necessarily reflect the current isotopic signature of the local vegetation. Soil organic carbon may contribute to the fuel mixture, with signatures deviating from the live vegetation (Santín et al., 2016).





Humic soil organic carbon (SOC) is generally enriched in <sup>13</sup>C compared to their plant source (Ehleringer et al., 2000). This enrichment is positively correlated to the stage of decomposition, with 1-3‰ enrichment of older SOM compared to fresh litter. As we measured areas that have been subjected to frequent (annual to biannual) high-intensity fires, we believe the combustion of old SOC to be small.

# 5 4.6.2 Fuel load representativeness

Fuel measurements of unevenly distributed fuels like trees, logs and even shrubs may be of limited value due to the small (50  $\times$  20m) plot size. While for fine fuels (i.e. grass and litter) we use weighted measurements before and after the fire, the combustion completeness of coarse woody debris, trees and shrubs was estimated. Even though the contribution of these classes during LDS fires is very low, this subjective and rough estimate leaves uncertainty over the contribution of these fuel

10 types to the fuel mixture.

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In measurements of isotopic signatures of the fuel, a minute fraction of the carbon content is assumed to be representative of the carbon in the bulk. In the case of the fine fuel measurements, fuel from ten 1  $m^2$  plots is collected. This is assumed to be representative of an entire fire which could be several km<sup>2</sup>. Of this material a small portion, which is thought to be representative of the larger sample, is dried and ground to a powder. Of this material, the carbon isotopes of approximately

100-400 ng are measured. Hence the representativeness of our samples can be questioned, but given that the average difference between duplicate fuel samples was  $0.24 \pm 0.13$  ‰ we assume this effect to be limited.

Regional differences in species distribution and climatological conditions may require a separate local fuel assessment before the isotopic source allocation of BB emissions. For example, while in Africa grasses tend to be well-represented by C4, the widespread existence of C3 grasses (e.g. *Echinolaena inflexa*) in the Brazilian Cerrado (Lloyd et al., 2008) makes the extrapolation from C3 vs C4 to trees and shrubs vs grasses more problematic. Besides photosynthetic pathways, isotopic signatures of the fuel are susceptible to the relative humidity, temperature, and precipitation regimes (Zech et al., 2014) which may lead to spatio-temporal variability.

#### 25 **5. Conclusion**

We measured isotopic fractionation in biomass burning (BB) products during pure and mixed fuel fire experiments under laboratory conditions and during prescribed savanna fires. Our results indicated that although the precursor plant material was the most important indicator for the isotopic  $\delta^{13}$ C signature in the emitted products, different combustion pathways in different fuel compounds as well as the kinetic isotope effect led to isotopic fractionation. In most products, the degree of fractionation

30 was both combustion phase- and vegetation type- dependent. Nonetheless, some emitted species proved to be more reliable for biomass source appointment than others.



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During flaming combustion, CO and CO<sub>2</sub> which make up the bulk of the carbon emissions, were both enriched compared to the bulk of the fuel. The trend of flaming emission samples being <sup>13</sup>C-enriched compared to smouldering samples also held true for CH<sub>4</sub>, organic carbon (OC), and elemental carbon (EC). This corresponds to the hypothesis that flaming combustion (FC) is dominated by combustion of relatively <sup>13</sup>C-rich cellulose and hemicellulose, whereas residual smouldering combustion (RSC) is accompanied by a shift towards <sup>13</sup>C-poor lignin dominated fuel. In addition, we found fractionation in CH<sub>4</sub>, CO, OC, EC and residual carbon to be significantly different (p<0.1) for C3 and C4 vegetation. This difference resulted in a convergence of the overall  $\delta^{13}$ C signatures of C3 and C4 emissions, which was particularly strong for CH<sub>4</sub> and OC.

- 10 While CO is often used as a tracer due to its high departure from relatively low background concentration, our results indicate that with the broad range of CO isotopic fractionation, CO from C3 plants emitted during the flaming phase may have a similar  $\delta^{13}$ C signature to that of CO emitted during smouldering of C4 plants. The large uncertainty range in the fractionation in CO suggests that it is not always possible to distinguish CO isotopes emitted from C3 and C4 plants, though it should be noted that relative CO emissions are inversely proportional to the MCE and high enrichment thus only affects a small fraction of the
- 15 CO emissions.

For BB aerosols, our measurements from prescribed fires in Niassa Special Reserve, Mozambique showed that while product and fuel signatures were highly correlated, particularly OC was strongly <sup>13</sup>C-depleted compared to the fuel. This suggested that either our fuel measurements significantly underestimated the C3:C4 ratio of the fuel, or <sup>13</sup>C-depletion due to other

- 20 processes (e.g. different EFs from the lab experiments, rapid chemical alteration in the atmosphere, sample evaporation or strong influence of background aerosol) complicated the source allocation of mixed fuels. Especially when using CO, CH<sub>4</sub>, OC an EC, a thorough understanding of background levels, δ<sup>13</sup>C signatures and atmospheric chemistry is therefore necessary. More field measurements of carbon fractionation in landscape fires may elucidate this.
- We found isotopic  $\delta^{13}$ C signatures in CO<sub>2</sub>, EC and char to be most representative of the  $\delta^{13}$ C signature of the precursor fuel. Typical residual smouldering emissions showed a stronger dependence on burning conditions which may complicate source appointment. It is therefore appropriate to account for some level of fractionation in order use stable carbon isotope for source allocation of savanna burning emissions. Since savannas are highly diverse in the C3:C4 ratio and burning conditions which affect this fractionation, more direct measurements could prove beneficial for better understanding and constraining this
- 30 fractionation. Nonetheless, our findings show that particularly through CO<sub>2</sub> and EC emissions stable carbon isotopes can be used to successfully estimate the ratio of C3:C4 fuels in the fire.





# Author's contributions:

RV, GRvdW, UD and EP designed the study; RV, AS, CQ and PW conducted the experiments in the laboratory; RV, PW and TE conducted the field measurements; AS, PY, CQ, RV, EP, UD and CvdV conducted the isotope analyses on the samples. RV wrote the manuscript with help from PW, UD, EP and GRvdW.

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Table 1: Overview of the measurements included in this study.

	δ <sup>13</sup> C				δ <sup>13</sup> C		δ <sup>13</sup> C		
Measurement description	MCE	(Fuel	δ <sup>13</sup> C	$\delta^{13}C$	(CH4)	$\delta^{13}C$	δ <sup>13</sup> C	(Residual) <sup>1</sup>	
		)	(CO)	(CO <sub>2</sub> )		( <b>OC</b> )	(EC)		
Controlled fire experiments FLARE fire laboratory, Vrije Universiteit Amsterdam (July 2018 – November 2020)	V	V	V	V	V	V	V	v	
UAS-based prescribed fire measurements in Niassa special Reserve, Mozambique (September – October 2019)	v	v				v	v	v	

<sup>1</sup> This includes a mixture of unburned fuel and ash sampled after the experiments

# Table 2: overview of the different laboratory experiments

Fuel type (FMC <sup>1</sup> )	Fuel $\delta^{13}C$	Phase <sup>2</sup>	Measured C-isotopes	# Samples
Dry cherry logs (12%)	-26.75‰	TF	$CO, CO_2$	8
Wet cherry logs (24%)	-26.75‰	TF	$CO, CO_2$	8
Cherry Logs (12%)	-26.75‰	TF, FL, RSC	CO, CO <sub>2</sub> , OC	17
Willow wood chips (11%)	-28.98‰	TF	CO, CO <sub>2</sub> , OC	6
Willow wood chips + maize	-20.80‰	TF	CO, CO <sub>2</sub> , OC	2
Oak wood chips (9%)	-25.85‰	TF, FL, RSC	CO, CO <sub>2</sub> , CH <sub>4</sub> , OC, EC	4
Oak wood chips + dry prairie grass	-16 to -23‰	TF, FL, RSC	CO, CO <sub>2</sub> , CH <sub>4</sub> , OC, EC	4
Dry prairie grass (4%)	-11.94‰	TF, FL, RSC	CO, CO <sub>2</sub> , CH <sub>4</sub> , OC, EC	4
Wet prairie grass (52%)	-12.12‰	TF, FL, RSC	$\mathrm{CO},\mathrm{CO}_2,\mathrm{CH}_4,\mathrm{OC},\mathrm{EC}$	2

5 1. FMC: Fuel moisture content (Percentage of wet weight)

2. TF: Total fire; FL: Flaming combustion; RSC: Residual smouldering combustion





Table 3: Weighted average carbon allocations measured in prescribed burns during the early dry season (EDS) and late dry season (LDS). Pre-fire carbon was allocated to Grass, Litter, Shrubs and Coarse woody debris (CWD) and post-fire carbon to residue (Ash, char and unburned fuels), CO<sub>2</sub> CO, CH<sub>4</sub>, organic carbon (OC), elemental carbon (EC) and non-methane hydrocarbon gasses (NMHC). The latter was estimated from emission ratios in literature.

Veget	ation	type	Pre-fire carbon				Post-fire carbon						
Veg. type			Grass	Litter	CWD	Shrubs	Residue	CO <sub>2</sub>	CO	CH4	OC	EC	NMHC
Dambo Grassland	EDS	% C <sub>fuel</sub>	100%	-	-	-	23%	63.5%	9.4%	0.7%	0.9%	(TC)	2.4%
		δ <sup>13</sup> C (‰)	-13.01	-	-	-	-17.75	-	-	-	-	-	-
	<b>LDS</b>	% C <sub>fuel</sub>	100%	-	-	-	9%	85.3%	4.4%	0.2%	0.3%	0.2%	0.7%
		δ <sup>13</sup> C (‰)	-14.78	-	-	-	-18.29	-	-	-	-22.06	-19.74	-
	S	% C <sub>fuel</sub>	46%	52%	2%	-	38%	57.7%	3.3%	0.1%	0.3%	(TC)	0.5%
Woodland	ED	δ <sup>13</sup> C (‰)	-13.53	-24.04	-28.75	-	-22.74	-	-	-	-	-	-
Savanna	S	% C <sub>fuel</sub>	33%	51%	16%	-	30%	63.8%	4.7%	0.2%	0.4%	0.1%	0.8%
	LD	δ <sup>13</sup> C (‰)	-13.68	-26.89	-28.03	-30.82	-27.85	-	-	-	-27.76	-25.42	-

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Figure 1. Post-fire partitioning of carbon for the flaming (left) and smouldering (right) phase for oak wood chips (C3) and prairie grass (C4). Note that the bottom 50%, containing only CO<sub>2</sub>, was cut from the graph to emphasise the smaller fractions. The numbers over the bars represent the percentage of carbon emitted in each phase. As the residue was only measured at the end of the fire, the residual carbon, calculated as the post-fire carbon in the residue over the pre-fire carbon in the fuel, was equally allocated to both phases. Carbon in NMHC was estimated to be 3.5 times the carbon in CH<sub>4</sub> based on Andrea (2019).



Figure 2: δ <sup>13</sup>C of the combustion products compared to the δ<sup>13</sup>C of the original fuel. The plot area-colour-scale represents the absolute fractionation (ε) compared to the precursor fuel. Linear regression formulas of the different curves and RMSE values are
 given in the legend on the right.



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Figure 3: Stable carbon isotope fractionation compared to the precursor fuel, plotted against modified combustion efficiency. Results are presented separately for flaming combustion (FC), residual smouldering combustion (RSC) and total fire (TF) samples. Non-significant linear fit lines (p>0.1) are presented in grey.







Figure 4. Post-fire partitioning of carbon (a) and the resulting fractionation (b) for oak wood chips (C3) and prairie grass (C4) where the weighted average (WA) was calculated as the fire-averaged measured fractionation weighed by the relative contribution (Fig. 3a on a scale of 0-1) of the respective carbonaceous species to the total post-fire carbon budget.



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Figure 5: The  $\delta^{13}$ C measured in the different volatility fractions of the captured PM<sub>2.5</sub> versus  $\delta^{13}$ C in the fuel. The temperature classes refer to the evaporation temperature steps in the oven of the organic carbon (OC) / elemental carbon (EC) analyser.







Figure 6:  $\delta^{13}$ C fractionation in burning products from this study (blue) and previous literature (orange). The numbers above the boxplots (n) and (p) represent the number of individual  $\delta^{13}$ C measurements, and the P-value calculated using a two-tailed t test with unequal variance, respectively. The literature 'Char' fraction was compared to the 'residual' fraction in this study.

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Figure 7: Left:  $\delta^{13}$ C fractionation of various sub-compounds of the fuel compared to the bulk plant for C3 (green) and C4 (red) vegetation. Middle:  $\delta^{13}$ C fractionation in pyrolysis products for flaming (blue) and smouldering (orange) combustion phases. Right:  $\delta^{13}$ C fractionation in pyrolysis products for C3 (green) and C4 (red) vegetation. The first row of numbers over the boxplots (n) represent the number of individual  $\delta^{13}$ C measurements taken from literature and from this study combined, with the number from this study in parentheses. The second row (p) represents P-value calculated using a two-tailed t test with unequal variance.







Figure 8: Representativeness of different pyrolysate species for the precursor fuel. Left: signature range of the bulk fuel. Right: signature range of the pyrolysate species.

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