

Physicochemical properties of charcoal aerosols derived from biomass pyrolysis affect their ice nucleating abilities ~~of biomass burning-derived charcoal aerosols~~ at cirrus and mixed-phase cloud conditions

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Abstract. Atmospheric aerosol particles play a key role for air pollution, health and climate. Particles from biomass burning emissions are an important source of ambient aerosols and have increased over the past, and are projected to further surge in the future as a result of climate and land use changes. Largely as a result of the variety of organic fuel materials and combustion types, particles emitted from biomass ~~combustion-burning~~ are often complex mixtures of inorganic and organic materials, with soot, ash and charcoal having previously been identified as main particle types emitted. Despite their importance for climate, their ice nucleation activities remain insufficiently understood, in particular for charcoal particles, whose ice nucleation activity has not been reported. Here, we present experiments of the ice nucleation activities of 400 nm size-selected charcoal particles, derived from pyrolysis of two different biomass fuels, namely a grass charcoal and a wood charcoal. We find that the pyrolysis derived charcoal types investigated do not contribute to ice formation via immersion freezing in mixed-phase cloud conditions. However, our results reveal a considerable heterogeneous ice nucleation activity of both charcoal types at cirrus temperatures. Inspection of the ice nucleation results together with dynamic vapor sorption measurements indicates that cirrus ice formation proceeds via pore condensation and freezing. We find wood charcoal to be more ice-active than grass charcoal at cirrus temperatures. We attribute this to the enhanced porosity and water uptake capacity of the wood compared to the grass charcoal. In support of the results, we found positive correlation of the ice nucleation activity of the wood charcoal particles and their chemical composition, specifically the presence of (inorganic) mineral components, based on single-particle mass spectrometry measurements. Even though correlational in nature, our results corroborate recent findings that ice-active mineral could largely govern the aerosol-cloud interactions of particles emitted from biomass burning emissions.

1 Introduction

Biomass burning emits greenhouse gases and aerosol particles into the atmosphere. The term smoke is generally used to describe all visible emissions of biomass burning, including gases and particulates (Cofer et al., 1997). The carbonaceous particulate matter associated with biomass burning smoke makes up a considerable fraction of the global aerosol burden (van der Werf et al., 2010; Schill et al., 2020; Reddy and Boucher, 2004; Andreae and Merlet, 2001). Such biomass burning aerosols are emitted from a wide range of processes, including wildfires, residential biomass combustion, and industrial combustion of biofuels. As a result of global warming, deforestation and changes in agricultural practices the frequencies and intensities of biomass burns in the form of wildfires have increased over the past and are projected to further increase, enhancing the atmospheric burden of biomass burning derived particles (Ford et al., 2018; Moritz et al., 2012; Donovan et al., 2017; Westerling et al., 2006; Marlon et al., 2008; Holden et al., 2018). Thus, understanding the properties and environmental impacts of aerosol emitted from biomass burning is crucial. Owing to the complexity of the various emission sources that particulate matter from biomass ~~combustion~~ burning encompasses, the aerosol types can display a range of different physical and chemical properties. Major particle types emitted into the atmosphere during biomass burning include soot, charcoal and (fly) ash particles, that are formed through different processes and at different stages of the combustion process (Chylek et al., 2015), and which are referred to as smoke particulates when considered as a combined entity (Cofer et al., 1997). Sometimes, the latter can also contain soil particles in the case of wild fires (e.g. Wagner et al., 2018).

Soot particles form during the flaming stage of the combustion process at the presence of oxygen-containing air and at high temperatures, usually above 1000 °C, through condensation of gas phase intermediates (e.g., benzene, acetylene, and polycyclic aromatic hydrocarbons), i.e., by gas-to-particle conversion, leading to graphitic carbon spherules that cluster together into soot aggregates (Glassman et al., 2014). Characteristic for these soot particles is their fractal morphology, water-insolubility and microstructure, containing a high content of refractory graphitic carbon (Petzold et al., 2013). This graphitic carbon causes strong absorption of light in the near-visible spectral region, due to the availability of non-localized electrons between the graphite layers. In contrast to soot, charcoal particles are formed from pyrolysis of the biomass in the absence or limited access of oxygen, and during the smoldering stage of the combustion process. Compared to soot particles, charcoal forms at considerably during the smoldering stage of the combustion process, which is characterized by lower temperatures, typically below approximately ~600 °C. At these temperatures the (organic) fuel material decomposes, usually at limited air (oxygen) access, but the carbon does not vaporize, leading to incompletely oxidized pyrolysis products, including charcoal particles (Chylek et al., 2015; Andreae and Merlet, 2001). Thus, considering their origin, charcoal particles are ~~considered as~~ primary aerosol particles, constituting charred, solid biomass material. ~~Consequently, c~~Charcoal particles often retain a recognisable structure and morphology of their respective biomass fuel source (Sharma et al., 2004; Masiello, 2004). This , making makes their morphology more variable, with charcoal particles often having irregularly shaped, platy morphologies compared to the fractal-like morphology typically observed for soot aggregates. In addition, charcoal particles are generally characterized by higher elemental ratios of oxygen-to-carbon (O/C) and hydrogen-to-carbon (H/C, Hammes et al., 2007; Kim et al., 2003) compared

to soot particles, i.e., a less graphitic microstructure, conferring a reduced absorbency (reduced sp²-bonded carbon content causes lower absorption of radiation, Bond and Bergstrom, 2006), as well as reduced thermal and oxidative stability. Thus, overall, atmospheric charcoal and soot particles have different properties (e.g., Han et al., 2010). A large fraction of the charcoal resulting from wildfires remains on the Earth' surface. This sedimentary charcoal is often used in the context of reconstructing characteristics of past fire and biomass burning (e.g., Adolf et al., 2018; Marlon et al., 2012). Yet, some entrainment by wind erosion of post-burn areas can cause uplift and atmospheric transport of surface charcoal particles depending on their size and density (Clark, 1988). More often, the emission of charcoal particles into the atmosphere occurs as a result of buoyant thermal convection in strong wild fires, that can result in considerable concentrations of charcoal particles long range transport of these (Tinner et al., 2006; Clark, 1988). Another important category of particles often ~~released~~ formed during biomass burning is ash, which in contrast to soot contain only a limited amount of carbon. ~~They~~ Ash denotes the solid, mineral-rich residuals remaining from combustion of organic substances, i.e., the refractory, inorganic material. These non-combustible constituents often derive from mineral inclusions or heteroatoms (excluding carbon and hydrogen) in the biomass fuel material, such as e.g., calcium (Ca), magnesium (~~Mn~~Mg) and iron (Fe). While (bottom) ash describes the powdery material remaining on the ground of the burning site, the term fine ash (or sometimes fly ash) is more commonly used in atmospheric science to describe the corresponding incombustible components that are emitted into the atmosphere with the burning emissions (Cofer et al., 1997). Related, fly ash particles are also emitted from coal combustion (e.g. Umo et al., 2015). While a previous study has estimated that only about 1 % of the total biomass burnt results in airborne charcoal particles (Cofer et al., 1997) other Previous-work has suggested that up to 27 % of fire-derived carbon can result in charcoal particles (Zimmerman and Mitra, 2017). Nonetheless, an unambiguous discrimination and separation of the various particles types from biomass combustion is not always possible, and interdisciplinary accepted definitions are a matter of an ongoing debate (Andreae and Gelencser, 2006; Petzold et al., 2013; Cofer et al., 1997). In addition, open wildfires are dynamic processes where the different flaming stages, i.e., stages of a combustion process and pyrolysis are often present at the same time. Thus, the smoke plumes usually entrain combined emissions of the different particle types (“smoke particulates”). This is consistent with observations from smoke plumes, including organic and inorganic components (Maudlin et al., 2015; Vassilev et al., 2010, 2012; Posfai et al., 2003; Li et al., 2003; Adachi et al., 2022). Moreover, previous studies have also shown that biomass burning particles can contain crystalline mineral phases that form during the combustion process (Vassilev et al., 2013; Gao et al., 2014), resulting from elements that are present within the fuel, including aluminium (Al), Ca, potassium (K), Fe, sodium (Na), and silicium (Si, Currie and Perry, 2007; Vassilev et al., 2010).

It is widely recognized that biomass burning particles have an important role in many environmental compartments. For instance, aerosol particles from biomass combustion affect the carbon cycle and biogeochemical processes when incorporated into surface reservoirs (e.g., Santín et al., 2016). Biomass burning derived particles also affect visibility and contribute to poor air quality, affecting human health (Reddington et al., 2015; Chen et al., 2017; Pardo et al., 2020). Yet, biomass burning particles also play a central role in atmospheric processes (Crutzen and Andreae, 1990; Andreae et al., 1994; Sokolik et al., 2019). For instance, they can affect the hydrological cycle and climate, directly through absorption and scattering of light, as

100 well as indirectly when acting as cloud nuclei, affecting precipitation formation and cloud microphysical properties, with
important ramifications for the regional and global energy budget (Bond et al., 2013; Bond and Bergstrom, 2006; Penner et
al., 1992; Chylek and Wong, 1995; Koren et al., 2004; Kaufman and Koren, 2006; Kaufman and Fraser, 1997; Ditas et al.,
2018; Yue et al., 2022). Despite the surge in emissions of biomass burning particles and their importance for climate, their
aerosol-cloud interactions, in particular their ability to act as ice nucleating particles (INPs, Vali et al., 2015) remains associated
105 with large uncertainties (Bond et al., 2013; Sokolik et al., 2019).

Several previous field and laboratory studies have reported the ice nucleation properties of particles derived from biomass
burning for conditions relevant for cirrus or mixed-phase clouds (MPC, Petters et al., 2009; Jahn et al., 2020; Jahl et al., 2021;
Korhonen et al., 2020; Levin et al., 2016; McCluskey et al., 2014; Twohy et al., 2010; Chou et al., 2013; DeMott et al., 2009;
Adams et al., 2020; Barry et al., 2021). For instance, DeMott et al. (2009) performed ice nucleation experiments at cirrus
110 temperatures, i.e., $T < 235$ K, and found that ice formation on 100 nm diameter particles emitted from combustion of a range
of fuel types, including rice straw, grass and wood in most cases was indistinguishable from homogeneous freezing of aqueous
solution droplets. Similarly, studies investigating the ice nucleation activity at mixed-phase cloud (MPC) conditions, i.e., $T >$
 235 K and relative humidities with respect to water (RH_w) larger than 100 %, have often found particles emitted from biomass
combustion to have no or negligible heterogeneous immersion freezing activities within this temperature regime (e.g., Petters
115 et al., 2009; Adams et al., 2020; Korhonen et al., 2020). Interestingly, biomass burning aerosols that formed ice via immersion
freezing often contained inorganic material (McCluskey et al., 2014; Petters et al., 2009; Jahl et al., 2021; Jahn et al., 2020).
For example, Petters et al. (2009) investigated the differences between the fuels that produced and did not produce INPs and
observed that the fuel types producing INPs overall had a higher probability of containing K, nitrite (NO_2^-) and inorganic
material, compared to the fuels that did not show heterogeneous ice nucleation, but only provided correlational evidence.
120 Similarly, McCluskey et al. (2014) found that the INPs from two different wildfires were dominated by mineral or metal
oxides, contributing 78 % and 67 %, respectively, to the total number of INPs analyzed per wildfire event (50-60 individual
particles analyzed per event), with high abundance of Ca and Al being characteristic features of these ice active particles.
Consistent with these observations, Jahn et al. (2020) recently attributed the immersion freezing ~~ice nucleation~~ activity to the
inorganic components present within bottom ash particles produced during biomass burning, as well as biomass burning aer-
125 osol particles sampled during combustion of grass and wood fuels. Specifically, Jahn et al. (2020) found crystalline Ca- and
Si-containing mineral phases, that were both released and newly formed during the combustion process, to largely govern the
ice nucleation activity of these particles. Similarly, a positive correlation between the presence of SiO_2 and ~~and~~-Ca and the
immersion freezing activity of ash particles has previously been reported (Grawe et al., 2016, 2018). The overall conclusions
emerging from these studies is that inorganic, mineral components are likely important for the ice nucleation activity of bio-
130 mass burning particles. Nonetheless, due to the variety of different particle types emitted from biomass burning and the range
of associated physicochemical properties, considerable uncertainty still exists regarding the ice nucleation activity of biomass
burning particles. One particle type that is often emitted into the atmosphere during biomass burning, but whose ice nucleation
activity has received little attention to date are charcoal particles.

In this study, we investigate the ice nucleation ability of charcoal particles at temperatures relevant for both cirrus and MPC regimes in laboratory experiments. We studied submicron charcoal particles derived from pyrolysis of two different types of biomasses, from wood and grass fuel, in an attempt to cover different emission sources relevant for atmospheric charcoal particles. A suite of auxiliary measurements, including particle water uptake and loss, morphology and chemical composition, complement our ice nucleation data to characterize the particle physicochemical properties and explore potential links to their ice nucleation activity.

140 2 Materials and Methods

2.1 Charcoal samples

Charcoal materials were obtained from the University of Zurich, Switzerland. The samples investigated are from two types different biomass fuel types, including a wood and a grass charcoal. The wood charcoal was sourced from debarked wood of chestnut trees (*Castanea sativa*) while the grass charcoal originated from rice straw (*Oryza sativa*). Charcoal particles from chestnut trees were used as surrogates for aerosols emitted from biomass burning of larger tree species. The *Castanea sativa* studied here is representative for forest growth across Europe, where it covers approximately 2.25 million hectares (Conedera et al., 2004). By contrast, charcoal particles from rice straw were used as surrogates for aerosols emitted from biomass burning in agricultural fields. Rice is one of the most important crops globally and burning of its straw is commonly practiced in many regions around the world to remove residues after harvest or used as a low-cost fuel in heating stoves (Singh et al., 2021).

Both types of charcoal particles were produced by pyrolysis in a pure nitrogen atmosphere at a temperature of 450 °C using a commercial furnace (Carbolite Gero GmbH & Co., Neuhausen, Germany, Model: GERO GLO 11/40), operated at a nitrogen flow rate of 500 L h⁻¹. Pyrolysis describes the thermochemical process where the biomass is decomposed at elevated temperatures within an environment where oxygen is limited (Lehmann and Joseph, 2015). In contrast to pyrolysis, combustion describes the thermochemical process involving the reactions of the biomass with oxygen, where heat is released (Glassman et al., 2014). Biomass pyrolysis generally leads to the formation a range of different compounds including gaseous (volatile), liquid and solid products, with the relative distribution of products being mainly dependent on the pyrolysis conditions (e.g. temperature, heating rate) and fuel material (Demirbaş and Arin, 2002; Williams and Besler, 1996). Charcoal particles encompass the solid residue that is formed in a pyrolytic atmosphere. Any organic material associated with the biomass fuel that is volatile at the pyrolysis temperature was removed from the sample by the purge flow during the particle preparation. The charcoal particles investigated here represent typical low temperature charcoals (Hammes et al., 2006). Details on the production method and a description of the physical and chemical properties is given elsewhere (Hammes et al., 2006, 2008). In brief, the O/C and H/C elemental ratios were found to be identical for wood charcoal and grass charcoal and were reported to be 0.3 and 0.7, respectively. In addition, both samples were dominated by aryl functionalities, i.e., aromatic carbon (70 %), as found by nuclear magnetic resonance spectroscopy, indicating overall low abundance of hydrogen. The specific surface areas were

found to be $2.0 \text{ m}^2 \text{ g}^{-1} \pm 10 \%$ and $5.9 \text{ m}^2 \text{ g}^{-1} \pm 10 \%$, for the wood and grass charcoal particles, respectively, determined by nitrogen (N_2) adsorption following the Brunauer–Emmett–Teller (BET) method (Brunauer et al., 1938). Hence, the surface areas of the charcoal particles investigated here are about an order of magnitude lower compared to other carbon-rich materials such as e.g., soot (Ouf et al., 2019). We note that these specific surface area values are characteristic for low temperature charcoals and that it has previously been shown that the properties of charcoal particles can strongly depend on the combustion conditions. For instance, the specific surface area of charcoal samples has been shown to increase with increasing maximum pyrolysis temperature, reaching values of several hundred square meters per gram of particle material for pyrolysis temperatures higher than those used here (Brown et al., 2006). The temperature of biomass burning in e.g. real wildfires occurs over a range of different temperatures (e.g., Mondal and Sukumar, 2014). Thus, in the natural environment, biomass pyrolysis at different temperatures can resulting in charcoal particles with different physicochemical properties. As such atmospheric charcoal particles can have different properties to the particles studied here.

For the ice nucleation experiments, the charcoal samples were aerosolized using a rotating brush aerosol generator (RBG, Palas, Model 1000) and passed through a cyclone (URG Corporation., Model 2000-30EHB, 50 % cut-off diameter $\sim 1 \mu\text{m}$ at a flow rate of 16.7 L min^{-1}) in order to confine the aerosol size distribution to mostly submicron particles, before entering a 2.7 m^3 stainless steel tank (Kanji et al., 2013). After filling the tank with charcoal aerosol up to a number concentration of approximately $4000\text{--}5000 \text{ cm}^{-3}$ the particles were kept suspended with a continuously stirring fan mounted at the bottom of the tank. Particles for the ice nucleation experiments and for aerosol analysis were directly sampled from the tank and a make up flow of particle-free, high purity nitrogen was used to keep the pressure in the tank constant throughout an experiment.

2.2 Ice nucleation measurements

Ice nucleation experiments were performed on size-selected aerosol particles at conditions relevant for both cirrus and MPCs. An aerosol stream sampled from the stainless-steel tank was passed through a differential mobility analyzer (DMA, TSI Inc., Model 3080, polonium source aerosol-to-sheath flow ratio of 1:7) to select a quasi-monodisperse aerosol population with mobility diameters (d_m) of $d_m = 400 \text{ nm}$. The fraction of double-charged particles at the used flow conditions was approximately 15 % ($d_m = 699 \text{ nm}$, Wiedensohler, 1988).

2.2.1 HINC measurements (cirrus temperature regime)

Ice nucleation experiments in the cirrus temperature regime were performed using the horizontal ice nucleation chamber (HINC), and is described in detail elsewhere (Lacher et al., 2017). Briefly, in HINC two ice-coated, horizontally oriented copper plates are ~~individually separately~~ cooled to different temperatures by individual recirculating coolers, with achieving a temperature control along each of the CFDC walls of \pm uncertainties of 0.1 K , corresponding to the thermocouple uncertainty. By setting the two walls of HINC to different sub-zero temperatures, so that a a linear temperature gradient is established across the vertical extent of the ice chamber. This results in a non-linear water vapor supersaturation profile across the vertical extent of the chamber, due to the non-linear relation between temperature and saturation water vapor pressure, described by

the Clausius-Clapeyron equation (e.g., Lohmann et al., 2016). The aerosol particles are assumed to be mostly transported through the CFDC within the so-called aerosol lamina at the center of the chamber. The thickness (vertical extent) of the aerosol lamina is constrained by the ratio of a particle-free nitrogen sheath flow and the aerosol sample flow. For the experiments presented here aerosol-to-sheath flow ratios between approximately 1:10 and 1:12 were used. The vertical extent of the aerosol lamina decreases with decreasing values for the aerosol-to-sheath flow ratio. The vertical extent of the aerosol lamina, ultimately controls the portion of the supersaturation profile that can be experienced by the particles within HINC, i.e., it governs the -causing the variations of T and RH_-the charcoal particles are exposed to -within the aerosol lamina to decrease.

The RH-conditions across the aerosol lamina at the center of the HINC chamber ~~are were~~ calculated from the linear temperature profile between the two horizontal chamber walls, the parametrization given by Murphy and Koop (2005), and a maximum temperature uncertainty of either CFDC wall of 0.1 K, conservatively -Assuming a lower limit for the aerosol-to-sheath flow ratio of 1:10 (see Mahrt et al., 2018 for details). -This translates to an upper limit -maximum -uncertainty of the relative humidity with respect to water (RH_w ; and with respect to ice, RH_i) of approximately ± 3 % (5 %) at $T = 218$ K. At the same center temperature, and for a center $RH_w = 105$ %, i.e. when the temperature gradient between the two walls is largest, the T variation across the aerosol lamina is approximately 1.1 K, again assuming an aerosol-to-sheath flow ratio of 1:10. These maximum RH- and T-uncertainties are conservative estimates and decrease for ice nucleation experiments at lower temperatures, as detailed elsewhere (e.g. Appendix D2 of Mahrt et al., 2018). The particle residence time (τ) within HINC can be varied by adjusting the position of a movable aerosol injector. However, the position was fixed for all our experiments corresponding to an average residence time of approximately 10 s for the temperature range investigated here. Ice nucleation experiments in HINC were conducted as RH-scans, where the RH is slowly increased (< 3 % $RH_i \text{ min}^{-1}$) at a fixed center temperature, by increasing the temperature gradient between the two walls. The number of aerosol particles that act as INPs and form macroscopic ice crystal (n_{ice}) at a given RH are detected at the exit of HINC. By dividing n_{ice} by the total number concentration of aerosol particles entering HINC, n_{tot} , we calculate the activated fraction (AF) of charcoal particles given as:

$$AF = \frac{n_{ice}}{n_{tot}}. \quad (1)$$

For all HINC experiments reported here, n_{ice} is given by the number of particles with diameters larger than 1 μm , as detected by an optical particle counter (OPC, Model GT-526S, MetOne Instruments, Grants Pass, Oregon, USA) at the exit of HINC. Given that the HINC experiments were all performed at $T < 233$ K, i.e. below the homogeneous ice nucleation temperature of water, all particles considerably larger than that of the size-selected aerosols particles must be ice particles. Theoretical growth calculations that have assumed pure diffusional growth of idealized spherical particles, using a conservative deposition coefficient of 0.1, suggest that ice particles form to diameters beyond 1 μm within the residence time of HINC (~ 10 s) for a wide range of temperature and relative humidity conditions, as detailed in our earlier work (Mahrt et al., 2018). Given the similar temperature and relative humidity conditions used in our experiments herein, we expect formation of ice particles sufficiently large to be detected by the OPC. Related, decrease in the ice particle size due to sublimation or melting during the transition from the exit of HINC to the OPC is assumed to be negligible, given the short transit time ($< 10^{-4}$ s). The value of n_{tot} was

determined by a condensation particle counter (CPC, TSI Inc., Model 3776) operated in low flow mode (0.3 L min^{-1}), in parallel to HINC, and taking the dilution factor due to the aerosol-to-sheath flow into account. Uncertainty in the AF is 14 %, resulting from the propagated counting uncertainties of 10 % from each the OPC and the CPC. Each AF curve is corrected for background counts from e.g., chamber-internal frost particles, by measuring the AF for particle-filtered air at the start and target RH of each RH-scan for a period of 5 min and linearly interpolating the background OPC counts for the RH range in-between. All AF curves reported are averages of two to three independent RH-scans. In HINC ice nucleation experiments were performed at $218 \leq T \leq 233 \text{ K}$, which are relevant temperatures for cirrus cloud formation.

2.2.2 IMCA-ZINC measurements (MPC temperature regime)

Immersion freezing mode experiments at $T > 230 \text{ K}$ were performed using a combination of the Zurich ice nucleation chamber (ZINC, Stetzer et al., 2008; Welti et al., 2009) and its vertical extension, the immersion mode cooling chamber (IMCA, Lüönd et al., 2010). The experimental setup has been described in detail previously (Lüönd et al., 2010; Welti et al., 2012). In short, particles are first activated into cloud droplets in IMCA at $T = 313 \text{ K}$. High supersaturation with respect to water of approximately 20 % at the top part of IMCA ensures cloud droplet activation of all particles, so that each aerosol particle becomes immersed into a single cloud droplet. As the particles flow through IMCA, the droplets with the charcoal particles immersed are continuously cooled to the experimental (aerosol lamina) temperature of ZINC and lowering the supersaturation to a value slightly above water saturation, in order to avoid evaporation of the droplets upon reaching the supercooled regions of ZINC. In ZINC, a vertical CFDC with parallel-plate design, the droplets are exposed to freezing temperatures between approximately 230 K to 255 K. Immersion freezing experiments were performed using so-called T -scans, where the RH_w is fixed to value of 104 % and the temperature is decreased in 2 K increments, from low to high values. At each temperature increment the AF is used to determine the fraction of frozen droplets at the end of ZINC, given by:

$$AF_{IMCA-ZINC} = \frac{n_{ice}}{n_{ice} + n_{droplets}}. \quad (2)$$

Here, n_{ice} and $n_{droplets}$ define the number concentration of ice crystals and cloud droplets, respectively, formed within IMCA-ZINC and detected with an OPC (Lighthouse, Model: Remote 5104) at the exit of the ZINC chamber. The uncertainty in AF results from a counting uncertainty of 10 % from each the OPC and the CPC resulting in a 14 % relative error. The initial particle number concentration entering IMCA-ZINC was recorded by a CPC (TSI Inc., Model 3787) operated in parallel. In the case of IMCA-ZINC experiments, n_{ice} denotes the number of particles with $d_p > 2 \mu\text{m}$, as determined by the OPC. All AF curves are an average of three individual experimental runs and corrected for background counts determined from sampling particle free air for a duration of 3 min at each temperature of the T -scan. The temperature uncertainty in IMCA-ZINC measurements was $\pm 0.1 \text{ K}$, translating into a maximum uncertainty in RH_w (RH_i) of approximately 3 % (5 %) at 218 K. The average particle residence time within ZINC was $\tau \approx 10 \text{ s}$ over the temperature range investigated here.

2.3 Auxiliary measurements for sample characterization

2.3.1 Transmission electron microscopy measurements

Aerosol particles from each sample were collected for TEM analysis. Polydisperse aerosol particles were sampled from the stainless-steel tank and impacted on standard Cu-TEM grids having a continuous carbon film and 400 mesh (Quantifoil Mirco
265 Tools GmbH, Großlöbichau, Germany). Particles were collected using the Zurich electron microscope impactor (ZEMI, Mahrt et al., 2018), a rotating drum impactor allowing for individual control of sample flow rate, sample time and impaction distance. Collected particles were analysed using a TEM JEOL-1400+ microscope (JEOL Ltd., Tokyo, Japan) equipped with a LaB6 filament, and operating at 120 kV.

2.3.2 Water vapor sorption measurements

270 Particle hygroscopicity was characterized by dynamic vapor sorption (DVS, Model Advantage ET 1, Surface Measurement Systems Ltd., London, UK). DVS gravimetrically measures the amount of water being taken up by the bulk sample, by determining the relative mass change, Δm , between the sample under dry conditions ($RH_w = 0\%$) and at each RH_w value during a DVS-scan. The DVS instrument has a weighting precision of $0.1\ \mu\text{g}$ and the absolute uncertainty in RH_w amounts to $\pm 0.5\%$. The flow rate through the DVS was $200\ \text{ml}\ \text{min}^{-1}$ of high purity N_2 (5.0 grade) for our experiments, and the RH was controlled
275 by humidifying the N_2 -flow. The bulk sample water uptake and loss were determined at 298 K by measuring the adsorption and desorption isotherms in 5% and 3% RH_w steps in the range of $0\text{--}80\%$ and $80\text{--}98\%$, respectively. The value of Δm was determined at each RH_w step after quasi-equilibrium was reached, which was defined as a mass change rate below $0.0005\ \%$ min^{-1} over a period of 10 min. If this criterion was not met, the mass that was reached after a maximum period of 1000 min at a given RH_w step, was used instead to calculate the amount of water that was taken up during quasi-equilibrium. Prior to the
280 DVS analysis each sample was dried directly within the DVS sample chamber at a temperature of 298 K and over a period of 1000 min, in order to outgas any pre-adsorbed water, followed by a full sorption cycle, starting with the adsorption and subsequently the desorption measurements.

2.3.3 Chemical characterization

The chemical composition of the particles was analyzed using single-particle aerosol mass spectrometry. Specifically, we
285 employed an aerosol time of flight mass spectrometer (ATOFMS, Model 3800; TSI Inc.) to obtain the chemical composition of individual aerosol particles as a function of particle size. A detailed description of the ATOFMS can be found elsewhere (Gard et al., 1997; Noble and Prather, 1996; Prather et al., 1994). In brief, aerosols are sampled into the instrument through a critical orifice. Downstream of the orifice an aerodynamic focusing lens (AFL), inertially focusses the particles, which exit the AFL through an acceleration nozzle, controlling the supersonic expansion of the particle loaded air and causing a size depend-
290 ent acceleration of the aerosols. Particle velocity is determined from light scattering pulses by measuring the transit time between two diode-pumped solid-state continuous wave laser beams operating at a wavelength of $\lambda = 405\ \text{nm}$ (Livermore

Instrument Inc., Model FMXL405). The vacuum aerodynamic particle diameter, d_{va} , is calculated from the measured velocity using a calibration curve obtained when using polystyrene latex spheres of known size and density. In the mass spectrometry source region a pulsed ultra violet Neodymium: yttrium-aluminium-garnett (Nd:YAG) laser (Big Sky Laser Technologies Inc., Model Ultra Series 230) with a wavelength of $\lambda = 266$ nm is used to ionize particles. The ATOFMS employs a laser ablation ionization technique, which allows to detect refractory aerosol components within the charcoal particles. The beam diameter of the Nd:YAG laser used was ~ 2.4 mm and the energy of the pulse can be varied, enabling some control over the fragmentation of the analyte. Here, a typical pulse energy of about 1 mJ was used in order to allow for a more complete ionization of the particles. Positive and negative ions are detected simultaneously using a dual-reflectron time-of-flight mass spectrometer.

The mass calibration of the time-of-flight signal was obtained from analyzing particles of known chemical composition prior to the experiments. Single particle mass spectra from the ATOFMS were imported into the TSI firmware MS-Analyze, where basic analysis, i.e., mass and size calibrations were applied to the data sets. For evaluation of the single particle mass spectral data, the calibrated data sets were then imported and processed within the flexible analysis toolkit for the exploration of single-particle mass spectrometer data (FATES, Sultana et al., 2017). FATES includes different features for ATOFMS data postprocessing, such as sorting the mass into groups, or converting the mass spectra into spectra with unit mass resolution (“stick spectra”), which is achieved by integrating the ion signal peak width around integer mass-to-charge (m/z) values, or calculating average spectra for a given set of single particle spectra. Here we report average mass spectra in terms of relative peak area and focus on the analysis of the averaged stick spectra of each charcoal type, examining these with respect to the presence of marker peaks. We note that different ions can result in the same m/z ratio and here peak assignment is informed by comparison to literature data, where different particles types of known composition with instruments that use a $\lambda = 266$ nm Nd:YAG laser for aerosol particle ablation and ionization, including other (commercial) ATOFMS instruments, as well as the ALABAMA and the SPASS mass spectrometers (Brands et al., 2011; Erdmann et al., 2005). The particle analysis by the ATOFMS was achieved directly sampling from the stainless-steel aerosol tank, similar to the ice nucleation measurements, but using poly-disperse aerosol. The objective of our ATOFMS analysis was to gain information on the average chemical composition of the two charcoal types studied here that could help to elucidate their ice nucleation activities. In addition, by employing a single-particle mass spectrometer, the degree of heterogeneity in chemical composition within a given charcoal type (aerosol population) can be assessed. This is important for complex aerosols such as biomass burning particles, which often contain variable amounts of organic carbon, elemental carbon and inorganic material. A total of 11’135 and 12’357 single-particle mass spectra were obtained for grass charcoal and wood charcoal, respectively.

3. Results and discussion

3.1 Ice nucleation ability

Figure 1 shows the AF of wood and grass charcoal as a function of temperature (230–255 K) relevant for MPC conditions, as obtained from the IMCA-ZINC experiments. The 400 nm diameter wood charcoal and grass charcoal particles showed a

similar ice nucleation activity in this range, with the AF -curves overlapping for both samples within experimental uncertainties, overall revealing a low immersion freezing ability. Specifically, values of $AF \leq 0.1$ were observed at $T > 237$ K for both wood charcoal and grass charcoal particles. At $T < 237$ K the AF increased, reaching values of around 0.59 and 0.66 for wood charcoal and grass charcoal particles, respectively, at $T = 235$ K, i.e., at the homogeneous ice nucleation temperature (HNT) of water. We indicate homogeneous freezing condition in Fig. 1 by the gray shading, using the parametrization of [Iekes-Earle et al. \(2010\)–\(2015\)](#). As the temperature in ZINC was further decreased below the HNT, the AF for both charcoal types increased, reaching maximum values of up to ~ 0.96 at $T = 231$ K. We note that particles leaving the aerosol lamina within ZINC, outside which they are exposed to different conditions of T and RH, can cause AF values below unity (DeMott et al., 2015; Garimella et al., 2017). The sharp increase in AF below temperatures of 237 K likely results from homogeneous freezing of soluble organic or inorganic material associated with the charcoal particles. Given that the maximum temperature during pyrolysis of the initial biomass material was 450 °C, most of the organics should have vaporized (Stratakis and Stamatelos, 2003) and carried away with the N_2 purge flow during pyrolysis. Hence, the increase in AF observed in our immersion-freezing experiments is likely caused by soluble inorganic material. This is further corroborated by the mass spectral signatures obtained from our ATOFMS sampling discussed below. Overall, we conclude from our experiments shown in Fig. 1 that the charcoal particles investigated here are poor immersion mode INPs.

At first sight, our results appear in contrast to those of earlier studies that reported appreciable immersion freezing activity of biomass burning particles, as discussed above. One way to reconcile the results reported here with those of previous studies is considering the particle surface area per droplet used to study the immersion freezing activity of biomass burning particles, that catalyzes their heterogeneous freezing activities (Lohmann et al., 2016). By accounting for the particles surface area, the AF values observed in our experiments can be normalized ~~to derive~~ and values of ice active surface site ~~densities~~ density, n_s , (e.g., Vali, 2014) ~~can be determined for our experiments. The n_s values of our experiments, that can then~~ directly be compared to those of previous studies, ~~with larger n_s values of a sample and at a given temperature, indicating higher (heterogeneous) ice nucleation activities. We note that the normalization to the surface area and comparisons among different studies only works under the assumption that the particle composition does not change with particle size. Nonetheless, the idea that an atmospherically relevant amount of surface area per droplet is an important parameter for evaluating ice nucleation, since the presence of large particles and large surface areas in a chemically inhomogeneous sample can trigger ice nucleation that would be otherwise absent in aerosol particles in the submicron range present in cloud droplets.~~

Assuming spherical particle geometry for our particles, one 400 nm charcoal particle immersed in a single droplet has a surface area of $\sim 0.5 \mu\text{m}^2$. This value likely denotes an underestimation of the (true) particle surface area due to the complex morphology of the charcoal aerosols. ~~Relying on this idealized assumption and~~ Instead, a more realistic surface area value can be estimated by using the N_2 -based BET specific surface area of the charcoal types reported in Hammes et al. (2006) ($2.0 \text{ m}^2 \text{ g}^{-1}$ for wood charcoal, $5.9 \text{ m}^2 \text{ g}^{-1}$ for grass charcoal), together with typical charcoal particle densities of 0.75 g cm^{-3} (Sander and Gee, 1990). Using these values and again assuming particle sphericity, we estimate surface areas of $\sim 50 \mu\text{m}^2$ and $140 \mu\text{m}^2$ for

a 400 nm diameter wood and grass charcoal particle, respectively. ~~This~~ The surface area values of $50 \mu\text{m}^2$ and $140 \mu\text{m}^2$ corresponds and measured AF translate into n_s values of ~ 10 to 80 cm^{-2} at $T = 244 \text{ K}$, which can be compared to those reported by other studies. ~~By contrast,~~ We note that previous studies ~~showing that have found~~ biomass burning particles to be efficient immersion freezing nuclei were mostly performed on polydisperse combustion aerosol populations or by using droplets in cold stage techniques. In such cases, each droplet can contain multiple biomass burning particles. Thus, the particle (or INP) surface area per droplet is considerably larger in such cases, increasing the freezing probability compared to our measurements. As an example, Jahn et al. (2020) reported n_s values of approximately $8 \cdot 10^3 \text{ cm}^{-2}$ for their most ice-active ash sample tested and at the lowest temperature investigated of $T = 244 \text{ K}$ (see their Fig. 1b), which is several orders of magnitude higher than the n_s values ~~observed hereof our experiments~~ at the same temperature (~ 10 to 80 cm^{-2} at $T = 244 \text{ K}$). This comparison illustrates that the surface area of ~~our~~ charcoal particles per droplet in our experiments was likely insufficient to catalyze immersion freezing. Therefore, we conclude that biomass burning particles with properties (composition and surface area) similar to the pyrolysis derived charcoal types studied here can likely not compete with the immersion freezing abilities of other atmospheric aerosol particles, such as mineral dust (e.g., Murray et al., 2012). In addition, we acknowledge that different physiochemical properties of the pyrolysis derived charcoal particle types studied here compared to combustion derived biomass burning particles investigated in other studies can further contribute to differences in observed ice nucleation activities.

Although the 400 nm diameter charcoal particles showed negligible immersion freezing activity, they revealed an enhanced ice nucleation ability at temperatures below the HNT. In Fig. 2 we show the complete AF -curves for the different cirrus temperatures investigated here, as obtained from our RH-scans performed in HINC. At $T < 233 \text{ K}$ the charcoal particles showed a considerable ice nucleation activity for $\text{RH} < \text{RH}_{\text{hom}}$, where RH_{hom} denotes conditions for homogeneous freezing of aqueous solution droplets, indicated by the black dashed lines (Fig. 2). In addition, we observed different ice nucleation activities between the grass charcoal and the wood charcoal particles, with the latter being overall more ice active at the cirrus temperatures investigated. As an illustration, the ice nucleation onset (corresponding to conditions where a value of $AF = 10^{-2}$ is reached) at 218 K was as low as $\text{RH}_w = 78 \%$ (130% RH_i) for the wood charcoal particles but for the grass charcoal particles the onset was observed around and 83% (138.5% RH_i). We discuss these observed differences in more detail deriving support from the auxiliary measurements.

As far as the ice nucleation activity of the charcoal particles in the cirrus temperature regime is concerned, we interpret this to result from a pore condensation freezing mechanism (PCF, Christenson, 2013; David et al., 2019; Fukuta, 1966; Higuchi and Fukuta, 1966; Koop, 2017; Marcolli, 2014). During PCF, water is taken up into pores and cracks available on the charcoal particles below water saturation, by capillary condensation, due to the lower equilibrium vapor pressure in confined spaces, compared to bulk liquid water (Kelvin effect, e.g., Marcolli, 2014; Fisher et al., 1981). At $T \leq \text{HNT}$ this pore water can freeze homogeneously. Once formed, the microscopic pore ice can grow out of the pore to form macroscopic ice crystals (David et al., 2019; Koop, 2017), which can be detected in our cirrus temperature experiments with the OPC. An ice formation mechanism on charcoal via PCF is consistent with recent studies, reporting PCF as the dominant ice formation mechanism for other combustion particle types including ash (Umo et al., 2019; Kilchhofer et al., 2021) and soot (Mahrt et al., 2018; Nihman et

al., 2019; Jantsch and Koop, 2021; Marcolli et al., 2021; Gao et al., 2022a). Ice formation via PCF is strongly determined by the aerosol physicochemical properties (Marcolli et al., 2021; David et al., 2020). For instance, the study by David et al. (2020) showed that during PCF, pore filling with liquid water and ice growth out of the pore is largely controlled by the pore size and the contact angle between water/ice and the particle surface (making up the pore wall material), when investigating different synthetic silica particles with well-defined pore diameter and varying their surface functional groups to mimic different contact angles. Additional RH-scans performed with HINC at temperatures of 243 K and 238 K (see Fig. A1) confirmed the absence of ice formation below water saturation for $T > \text{HNT}$, as confirmed by additional RH-scans performed with HINC at temperatures of 243 K and 238 K (see Fig. A1), further. Such a distinct increase in the ice formation ability at $T \leq \text{HNT}$ cannot be explained by classical nucleation theory assuming ice formation via deposition nucleation, where a liquid water phase is absent (Welti et al., 2014). Thus, the marked dependence of ice formation on HNT suggests that the charcoal particles investigated herein form ice via PCF, where ice formation proceeds and lack the active sites for immersion freezing. The marked dependence of ice formation on HNT is incompatible with the classical deposition ice nucleation (Welti et al., 2014) and provides strong evidence that ice formation on the charcoal particles investigated here occurs via homogeneous freezing of liquid water in pores for $\text{RH}_w < 100\%$ in support of PCF. These interpretations are consistent with observations of previous studies (e.g. David et al., 2019). We further point out that the absence of ice nucleation for $\text{RH} < \text{RH}_{\text{hom}}$ at $T = 233 \text{ K}$ is not inconsistent with PCF, but is explained by accounting for the negative pressure (tension of the water meniscus) experienced by the capillary condensate, i.e., the supercooled pore water (Marcolli, 2020). Marcolli (2020) demonstrated that at temperatures close to the HNT capillary condensates within pores only form close to water saturation. At these humidity conditions, the pore water experiences almost ambient pressure conditions, i.e., hardly any negative pressure. In turn, this causes the homogeneous ice nucleation rates to be lower compared to the cases at 228 K, 223 K and 218 K, where we observed ice nucleation on the charcoal particles at considerably lower relative humidities and below homogeneous freezing conditions (see Fig. 2). At these temperatures the charcoal pores fill at lower RH compared to the case of $T = 233 \text{ K}$, hence the pore water experiences higher negative pressures (Marcolli, 2020) and therefore higher homogeneous ice nucleation rates. We thus conclude that at $T = 233 \text{ K}$ the homogeneous ice nucleation rates are too low to observe ice formation within the particle residence time of $\sim 10 \text{ s}$ within HINC (David et al., 2019; Marcolli, 2020).

Altogether, the high ice supersaturations required to nucleate ice on these particles at $T = 233 \text{ K}$, and the absence of (strong) heterogeneous ice formation at $T > 233 \text{ K}$ (Figs. 1 and A1 and Fig. 4), render it unlikely that ambient aerosols with physicochemical properties similar to the pyrolysis derived charcoal particles investigated here contribute to heterogeneous ice nucleation at $T > \text{HNT}$. Yet, at $T \leq \text{HNT}$ the charcoal particles revealed heterogeneous ice nucleation at conditions well below those relevant for homogeneous freezing of solution droplets, making the charcoal particles investigated here considerably better cirrus ice nuclei compared to other biomass burning derived particles investigated earlier (DeMott et al., 2009).

3.2 Water vapor sorption

Figure 3a shows the water vapor sorption and desorption isotherms of the two charcoal samples, determined by DVS experiments. These measurements allow us to simultaneously infer information of the charcoal hydrophilicity and porosity. During
425 DVS water uptake and loss is determined gravimetrically and in Fig. 3a we show the mass change, Δm , denoting the quasi equilibrated (steady state) moist sample mass at each RH_w value, relative to the dry sample mass at 0 % RH_w . The solid lines and filled symbols in Fig. 3a represent water uptake isotherms and the dashed lines and open symbols represent the water loss isotherms for the same DVS run.

The grass charcoal sample exhibits a shallow water uptake curve up to 80 % RH_w , with $\Delta m < 0.5$ %. The corresponding water
430 vapor-based BET specific surface area of the grass charcoal sample was determined as $BET_{H_2O} = 7.9 \text{ g m}^{-2}$ (see Appendix D). Between 83 % to 98 % RH_w the grass charcoal shows a more pronounced water uptake with a maximum in Δm of around 3 % being reached at the largest RH_w value (98 % RH_w). The absence of a plateau at these high RH_w suggests that formation of a water multilayer and free water would occur if the RH_w was further increased. We interpret the gradual curvature of the water uptake observed for the grass charcoal as a type II isotherm, following the IUPAC (International Union of Pure and Applied
435 Chemistry) classification recommendations (Thommes et al., 2015; Sing et al., 1985). Type II isotherms are given by reversible physisorption of gases on macroporous adsorbents, as discussed in detail elsewhere (Thommes et al., 2015). While hile type II isotherms are characteristic for macroporous (pore diameter $> 50 \text{ nm}$) adsorbents, the abrupt change in water uptake around 83 % and the enhanced water uptake at higher RH_w indicates some water uptake by filling of mesopores (pore diameter between 2 nm to 50 nm, Thommes et al., 2015). The presence of mesopores on the grass charcoal is further supported by the
440 (weak) hysteresis observed between the water uptake and the water loss curves. The presence of mesopores and is consistent with (weak) PCF ice formation observed for the grass charcoal particles at some cirrus temperatures (Fig. 2, $T \leq 223 \text{ K}$). The hysteresis of the grass charcoal is typical for a H3-type hysteresis, which is often observed for adsorbents with a type II adsorption isotherm (Thommes et al., 2015). Nonetheless, we note that overall, the observed hysteresis is weak, thus the deviation from an idealized type II isotherm, where adsorption is assumed to be fully reversible, is low. This indicates that while
445 some mesopores are present on the grass charcoal particles, this sample is likely dominated by macropores. A H3-type hysteresis loop and a dominance of macropores is characteristic for aggregates of plate-like particles (Thommes et al., 2015). A plate-like particle morphology for the charcoal aerosols is qualitatively supported by our TEM images shown in Fig. 3b (see also Fig. C1), and is further consistent with previous studies reporting that charcoal particles mostly sustain the shape of the fuel material to some degree (Sharma et al., 2004).

450 The wood charcoal sample shows a distinctively different water uptake and loss behavior compared to the grass charcoal sample. Specifically, the water uptake curve of the wood charcoal reveals a pronounced concave curvature with an initial steep increase reaching values of $\Delta m = 6.5$ % at 40 % RH_w , and a more gradual uptake as the RH_w is further increased. We attribute this to a type IV(a) isotherm (IUPAC classification recommendation). Nonetheless, although we note that a final saturation plateau at high RH_w , a typical feature associated with type IV(a) isotherms (Thommes et al., 2015), was not observed for the

455 wood charcoal sample. The strong increase in sample mass at very low RH_w is a common feature of samples that have micropores (pore diameter < 2 nm Thommes et al., 2015) and/or large specific surface area. The H_2O -based BET specific surface area of the wood charcoal sample corresponding to the water uptake isotherm of our DVS measurement was determined as $BET_{H_2O} = 161.3 \text{ g m}^{-2}$ (see Appendix D). A similar adsorption behavior has previously been reported for microporous combustion particles (e.g., Popovitcheva et al., 2000; Popovitcheva et al., 2008). The relatively broad RH_w range over which the
460 concave shape of the water uptake isotherm extends in our experiment, suggests a broad range of differently sized micropores. We note that such micropores are negligible for ice formation via PCF, because micropores are too narrow to accommodate a critical ice embryo needed for ice formation when using classical nucleation theory to estimate the size of a critical spherical ice cluster. In fact, in a previous study, the smallest pore for which ice nucleation was experimentally observed in a set-up similar to the one used here, had a radius of $r = 1.25 \text{ nm}$ (David et al., 2020). Nonetheless, our DVS measurements also contain
465 characteristic features that indicates the presence of mesopores on the wood charcoal particles. Specifically, the initial increase in water mass along the water uptake curve of the wood charcoal initially proceeds via a similar path as the corresponding part of the type II isotherm of the grass charcoal, even though at higher water masses. At around 40 % RH_w the water uptake rate increases, indicating pore condensation. In addition, ~~The~~ the wood charcoal DVS measurements are accompanied by a clear hysteresis, typical for type IV(a) isotherms, and absent in the case of type IV(b) isotherms (Thommes et al., 2015). We attribute
470 this hysteresis to a H4-type hysteresis that is typical for micro- and mesoporous carbonaceous material (Thommes et al., 2015). The availability of mesopores on the wood charcoal sample supports our interpretation of ice formation via PCF on these particles, described above.

Overall, our DVS measurements reveal that the wood charcoal samples show a higher water uptake capacity compared to the grass charcoal sample. For instance, at 98 % RH_w , the water uptake of wood charcoal is approximately a factor ~ 4 larger
475 compared to the grass charcoal sample. We interpret the higher water affinity of the wood charcoal sample compared to the grass charcoal to result partly from a lower charcoal-water contact angle of the former, which is consistent with the larger ice nucleation activity of the wood charcoal particles at $T < HNT$ (see Fig. 2). However, we point out that the difference in (PCF-) ice nucleation activity observed between the wood charcoal and grass charcoal is not constant across the cirrus temperatures investigated here, indicating that it is not directly proportional to the hydrophilicity and mesopore volume observed in the DVS
480 measurements. This is consistent with previous DVS measurements and PCF-ice nucleation observations for soot particles (Mahrt et al., 2020), and suggests that other aerosol properties such as the chemical composition might need to be considered in order to explain the observed ice nucleation activity.

3.3 Chemical composition

Figure 4 shows a summary of the chemical composition of the charcoal particles, as obtained from our ATOFMS sampling.
485 Depicted are the average anion and cation stick spectra of grass charcoal and wood charcoal, respectively, where the peaks denote average ion intensities in terms of relative peak area overall particles that resulted in a detectable ion signal upon being hit with the Nd:YAG laser. Major peaks with relative area signals larger or equal to 0.02 are labelled for clarity. We point out

that the ATOFMS is a semi-quantitative instrument and that the relative peak intensities do not correspond to the actual mass fraction of the respective component.

490 The anion spectrum of grass charcoal (Fig. 4a) is marked by peaks of organic ions, including the typical C_n fragmentation (C_1^- - C_5^- , m/z 12...60), as well as peaks occurring at 25 (C_2H^-), 26 ($C_2H_2^-/CN^-$), 27 ($C_2H_3^-/NCH^-$), 49 (C_4H^-), and 50 ($C_4H_2^-$). The presence of a peak at 46 (NO_2^-), even though at very low relative intensity, renders the presence of nitrogen containing ~~eations~~ ions at m/z of 26 (CN^-), and 27 (NCH^-) ~~likely possible, and is~~ further supported by the peak at 42 (CNO^-). Ion peaks at 26 (CN^-) and 42 (CNO^-) have previously been used as an indicator of biological aerosol (Sierau et al., 2014; Creamean et al., 2013; 495 Pratt et al., 2009), which should be absent in the charcoal particles used here. Thus, the anion peaks at m/z of 26 and 27 in our average grass charcoal spectra, are more likely attributable to hydrocarbons ($C_2H_2^-$ and $C_2H_3^-$, respectively), or less likely but still possible, organic nitrogen (CN^- and HCN^-), consistent with these peaks being previously been observed for cellulose particles and particles from biomass burning (Schmidt et al., 2017). The small peak at 97 (HSO_4^- ; low relative intensity \ll 0.1) suggests the presence of further secondary material on the grass charcoal particles. Additionally, the grass charcoal contains a small peak at 79 (PO_3^-). Overall, these peaks are all typical marker ions occurring in aerosol particles from biomass 500 burning emissions (Schmidt et al., 2017; Zawadowicz et al., 2017).

Characteristic marker peaks for biomass burning aerosol are also found in the average cation spectrum of the grass charcoal (Fig. 4d), including peaks at 23 (Na^+), 24 (C_2^+) and 40 ($Ca^+/NaOH^+$). Yet, another ion typically occurring in biomass burning aerosol is potassium (K^+ , m/z 39), whose peak is dominating the average cation spectrum of grass charcoal. This is consistent 505 with previous studies showing that mass spectra obtained by ablation and ionization mass spectrometers are often dominated by ions with low ionization efficiencies such as alkali metals (Zelenyuk and Imre, 2005). In addition, the ionization efficiency can be impacted by the particle matrix in laser ablation mass spectrometry (Gross et al., 2000; Reilly et al., 2000), as well as the particle size and morphology (Kane and Johnston, 2000). We further note that non-uniform ablation and ionization, e.g., due to the Gaussian intensity profile of the Nd:YAG laser beam, can cause the resulting mass spectrum to not contain information on the entire particle composition (Ge et al., 1998), making the ATOMFS analysis a semi-quantitative method, as noted 510 above. In Fig. B1 we show the mass spectra depicted in Fig. 4 in a complementary way, to better reflect the variation in relative peak area across the entire charcoal particle population. Specifically, Fig. B1 shows what fraction of the investigated particles contained a certain ion species, together with the relative ion signal intensity. Even though there is some variation in the relative peak intensities, we note that a considerable fraction of the charcoal particles contains the characteristic (average) ion peaks shown in Fig. 4. Thus, we conclude that the variability in chemical composition within a given charcoal types is sufficiently low and that that the average spectra shown in Fig. 4 provide a reasonable picture of the composition of the particles investigated here. The number size distributions of the particles contributing to the average spectra in Figs. B1 and 4 are shown in Fig. B2. For both charcoal types, the mode of the particle size distribution is in the submicrometer range, between 300 to 500 nm (vacuum aerodynamic diameter). Thus, we consider the average spectra shown in Fig. 4 to be representative for the 400 520 nm charcoal particles used for our ice nucleation experiments.

The average anion spectrum of the wood charcoal is shown in Fig. 4b. The wood charcoal particles contained typical marker ions at C_1^- - C_6^- (m/z 12...72) and associated hydrocarbon peaks at 25 (C_2^-), 26 ($C_2H_2^-$), 37 (C_3H^-), 49 (C_4H^-), 50 ($C_4H_2^-$), 51 ($C_4H_3^-$), 52 ($C_4H_4^-$), 73 (C_6H^-) and 74 ($C_6H_2^-$), although some of these peaks have relative areas below 0.1 (see Fig. B1c). In addition, peaks of secondary material were also present at 97 (HSO_4^-). A peak that was present in the anion spectrum of wood but not in grass charcoal appears at m/z of 76, which we attribute to $AlO_2(OH)^-$. Alumina species are known to contribute to ice nucleation activity of ambient particles, as they form significant components of atmospherically relevant mineral particles such as illite, which are also known to be porous, ice-active aerosol particles (David et al., 2019; Hiranuma et al., 2015; Welti et al., 2009).

The presence of aluminium is further corroborated by the average cation spectrum of wood charcoal depicted in Fig. 4e, showing a prominent peak at 27 (Al^+). The presence of aluminium in the wood charcoal is compliant with earlier observations of McCluskey et al. (2014), who reported aluminium to be abundant in ice nucleation particles from wildfires, as noted above. Next to aluminium the cation wood charcoal spectrum indicates the presence of other metals ions such as 56 (Fe^+). Also present are peaks at 23 (Na^+), 24 (Mg^+) and 40 (Ca^+). These peaks are characteristic for mineral material, and have previously been reported for e.g. dust samples (e.g., Gallavardin et al., 2008; Marsden et al., 2019). The presence of calcium and magnesium within our charcoal particles is also consistent with recent results of Adachi et al. (2022), who have reported- these species to be important components of (fine) ash particles emitted by biomass burning.

~~In addition,~~ The cation spectrum of wood charcoal is characterized by the presence of 39 (K^+), as well as a C_n fragmentation pattern (C_1^+ - C_3^+ , m/z 12, 24, 26). Overall, the peaks observed in the anion and cation spectrum of wood charcoal contain ions often observed in spectra of fly ash particles, as reported previously (Zawadowicz et al., 2017; Grawe et al., 2018; Xu et al., 2018). For example, similar peaks have previously been reported by Grawe et al. (2018) when sampling aerosol particles from different ash types sourced from coal-burning power plants and also measured with a single particle mass spectrometer, where more than 80 % of all particles samples (across all ash types) contained peaks at 27 (Al^+) and 40 (Ca^+). Similarly, recent findings have demonstrated inorganics (Ca, Mg) to be abundant in ash particles from biomass burning (Adachi et al., 2022).

Overall, our ATOFMS results reveal the presence of mineral components in the wood charcoal particles. The availability of mineral ions in the wood charcoal correlates positively with their enhanced ice nucleation activity compared to the grass charcoal particles, where ion signatures characteristic for mineral components were largely absent in the average mass spectra. These results parallel the recent findings by Jahn et al. (2020) that combustion-derived minerals, resulting from transformation of inorganic material that is naturally present within the fuel material, might govern the ice nucleation activity of particles emitted by biomass burning. This is further supported by other studies that suggested inorganic or mineral components to play a key role for the ice nucleation activity of particles emitted by biomass burning (Petters et al., 2009; Jahl et al., 2021; McCluskey et al., 2014). At the same time, we acknowledge that while our ATOFMS analysis provides valuable information on the chemical composition of the charcoal particles, including their refractory components, a detailed chemical mechanism by which these minerals promote their ice nucleation activity cannot be explicitly derived here, given the correlational nature

of our data. Related, the presence of some cirrus ice nucleation activity for the grass charcoal particles, where mineral signatures were largely absent, underscores the need for future studies to better understand the relative importance of pores and active (mineral) sites for the ice nucleation activity of charcoal particles and biomass burning particles in general.

4. Summary and Conclusions

In this study we investigated the ice nucleation ability of charcoal particles, an important class of aerosols generated during biomass combustion. Two charcoal samples were tested, derived from pyrolysis of relevant biomass types, namely wood and grass charcoal. Ice nucleation experiments were carried out on 400 nm size-selected particles. Such submicron charcoal particles expected to be transported into higher altitudes (Clark and Hussey, 1996; Gilgen et al., 2018) where they can affect cloud formation. Ice nucleation activities were tested over a temperature range of $218 \text{ K} \leq T \leq 253 \text{ K}$. In the MPC regime ($T > 233 \text{ K}$), the ice nucleation was tested in immersion freezing mode, while for the cirrus temperatures ($T \leq 233 \text{ K}$), RH-scans were performed, covering a range of RH_w (RH_i) 65–105 % (100–180 %). The bulk aerosol water uptake and loss were characterized gravimetrically by means of dynamic water vapor sorption (DVS) measurements, allowing to infer material porosity, and the chemical composition of the particles was characterized using a single particle aerosol time-of-flight mass spectrometer (ATOFMS).

We found that the 400 nm charcoal particles investigated here were poor immersion freezing INPs at MPC temperatures, independent of the charcoal type, even in the presence of mineral components. In comparison to previous studies that often reported some immersion freezing of biomass burning particles, we attributed this to the small particle (INP) surface area available per droplet in our experiments. By contrast, at cirrus temperatures, we found a considerable heterogeneous ice nucleation ability of the pyrolysis derived charcoal particles at relative humidities below those required for homogeneous freezing of solution droplets. This dependence of the ice formation ability on the homogeneous ice nucleation temperature of pure water ($\text{HNT} = 235 \text{ K}$) provides ample evidence that ice nucleation on charcoal proceeds via a pore condensation and freezing (PCF) mechanism. At $T < 233 \text{ K}$, the observed ice nucleation activity was higher for wood charcoal compared to grass charcoal particles. In this temperature range, the cirrus ice nucleation activity correlated with both physical and chemical particle properties. In terms of physical properties, the ice nucleation activity positively correlated with the particle porosity. Specifically, the wood charcoal particles showed higher porosity and water uptake capacity, consistent with the higher ice nucleation activity via PCF of the wood charcoal compared to the grass charcoal. In terms of particle chemical properties, the cirrus ice nucleation activity positively correlated with the presence of inorganic mass spectral features. More specifically, the mass spectra of the wood charcoal particles contained ions indicating the presence of mineral components that were mostly absent in the mass spectra of the grass charcoal. This is consistent with findings of earlier studies that reported ice active particles generated from combustion processes to contain mineral components (Jahn et al., 2020; Petters et al., 2009; Grawe et al., 2018), and other studies that have reported ~~ice nucleation activity of~~ mineral components of other aerosol types to nucleate ice (e.g., Archuleta et al., 2005).

Overall, we found considerable similarities of the grass and wood charcoal average mass spectra with those reported in the literature for particles classified as “biomass burning particles” and “(coal) fly ash particles”, respectively. This could indicate that charcoal particles as studied here are atmospherically more widespread and abundant than previously thought. This is corroborated by recent findings of Adachi et al. (2022), who reported “fine-ash particles” (classified by the authors as particles having Ca and Mg > 0.5 wt%) to be a major constituent associated with biomass burning, estimating their global emission to range between 8.8 Tg yr⁻¹ to 16.3 Tg yr⁻¹. Taken together, these studies reveal that clear identification, differentiation and quantification of the various particle types associated with complex biomass burning emissions remains challenging but is essential to confirm assumptions about their abundance and environmental effects made in models.

In this regard we recognize that our results are confined to charcoal particles produced by low temperature pyrolysis, and hence cannot necessarily be generalized to atmospheric charcoal particles and other particles emitted by biomass burning. Certainly, in real biomass burning events the temperature can vary considerably (Mondal and Sukumar, 2014), affecting pyrolysis yields and particulate and gas product distributions (Demirbas, 2007; Safdari et al., 2019). For instance, Safdari et al. (2019) have reported tar-like material to make up between 44 % to 62 % by weight of the particulate products when investigating the pyrolysis of 14 common plant species native to the United States, consistent with other work that has reported tar particles to be a dominant component of biomass burning emissions (e.g., Adachi et al., 2019). Interaction of charcoal particles with particulate and gas components co-emitted during biomass pyrolysis can alter their ice nucleation abilities. For example, tar-like material and condensing organic vapors can fill pores available on the charcoal particles and hence render them inaccessible for PCF ice nucleation, an effect that has previously been observed for soot particles (e.g., Gao et al., 2022b; Zhang et al., 2020). Related, it was recently reported that biomass burning particles can undergo atmospheric aging processes, leading to removal of organic coatings that mask the aerosol’s ice-active sites, ultimately enhancing their ice nucleation activity (Jahl et al., 2021). Such effects were absent for the charcoal particles studied here, as the organic vapors formed during pyrolysis were continuously removed in the experimental setup used to generate the particles, as described above.

Therefore, future laboratory and field measurements with more realistic charcoal particles as studied here are crucial to the further improve our understanding of the discriminative their physical and chemical (composition) properties of the particle types emitted from biomass burning, and how these in turn affect in relation to their cirrus ice nucleation activities. In particular it will be important to better understand the role of organic material associated with atmospherically realistic charcoal particles in determining their ice nucleation activity, and how this is impacted by atmospheric aging processes. Future studies are also needed; to investigate the relative importance of the ice nucleation ability of pyrolysis derived charcoal to that of other particle types emitted during biomass burning. Particular focus should be put on investigating the ice nucleation abilities of such particles at cirrus temperatures, where data remains limited, in particular in the cirrus temperature regime where the availability of data remains scarce.

In the present study, we avoided generalizations about the relative importance of physical over chemical particle properties in determining ice nucleation activities given the correlational nature of our ice nucleation results and the physicochemical particle properties investigated here. Furthermore, in view of INPs making up only a small fraction of the total aerosols emitted,

620 correlations with bulk particle properties should be interpreted carefully. Therefore, for future studies it will also be crucial to more holistically understanding the physical and chemical properties of the highly complex biomass burning aerosol on the level of single particles that form and do not form ice. Such analysis could be achieved from examining ice crystal residual particles, to attribute the ice nucleation activity to their properties with more certainty and disentangle their relative contributions and importance, by comparing to properties of interstitial particles that did not form ice crystals.

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1015 *Sample availability:* Charcoal samples were obtained from the University of Zurich, Switzerland:
<https://www.geo.uzh.ch/en/units/2b/Services/BC-material/Black-carbon-rich-materials.html>

1020 *Author contributions.* FM prepared all figures and wrote the initial manuscript draft with contributions from CR and ZAK. FM, CR and ZAK designed the experiment. KG and FM conducted and analyzed HINC measurements. CR conducted and analyzed IMCA-ZINC measurements and sampled particles for TEM analysis. CD ran DVS experiments. FM sampled ATOFMS data. MAZ and FM analysed and interpreted AFTOMS data. All authors contributed to data interpretation and to revising the manuscript.

1025 *Competing interests.* The authors declare that they have no conflict of interest.

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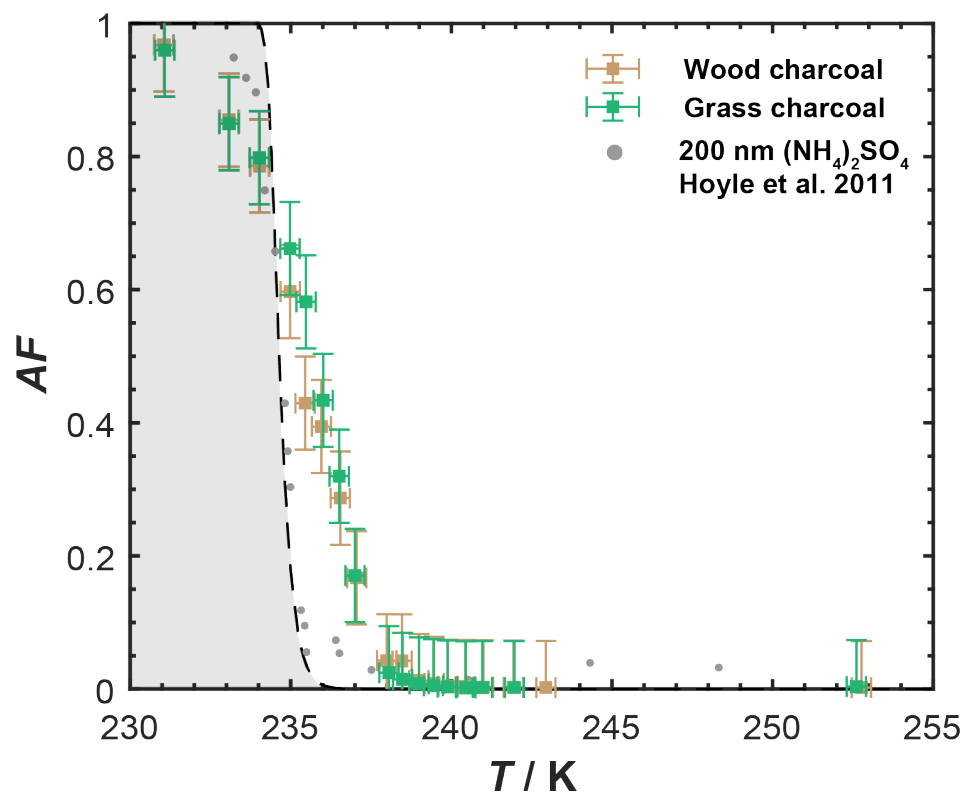
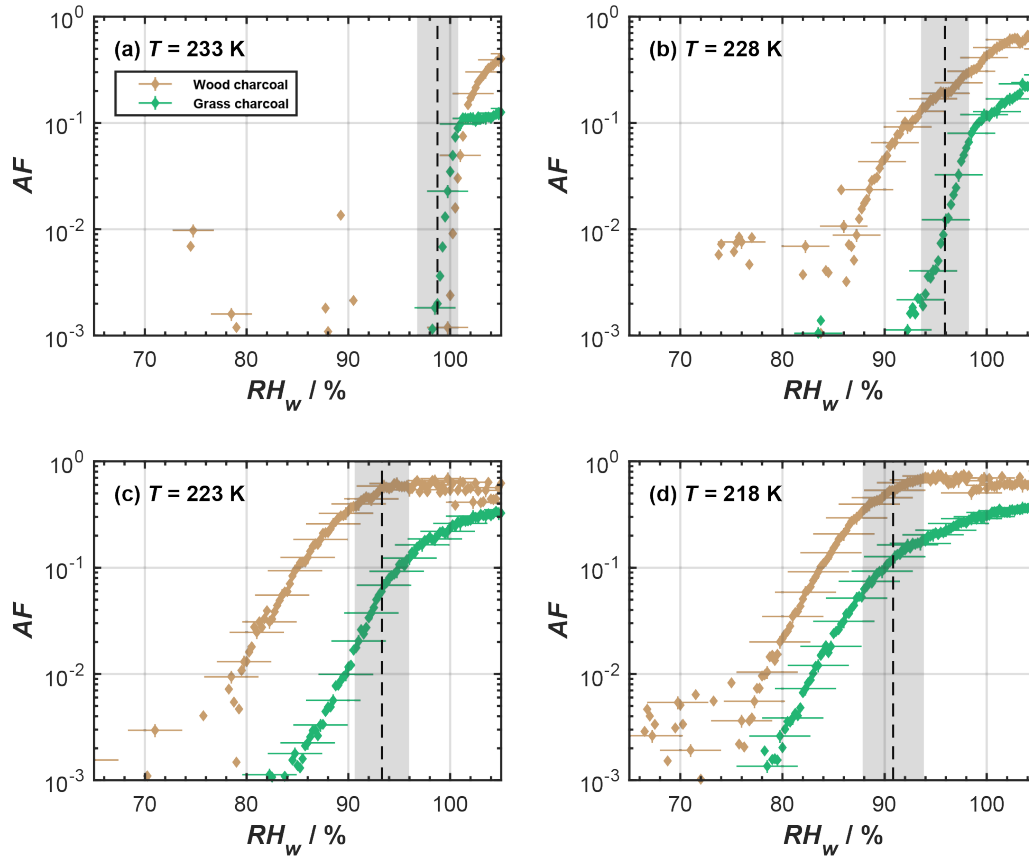
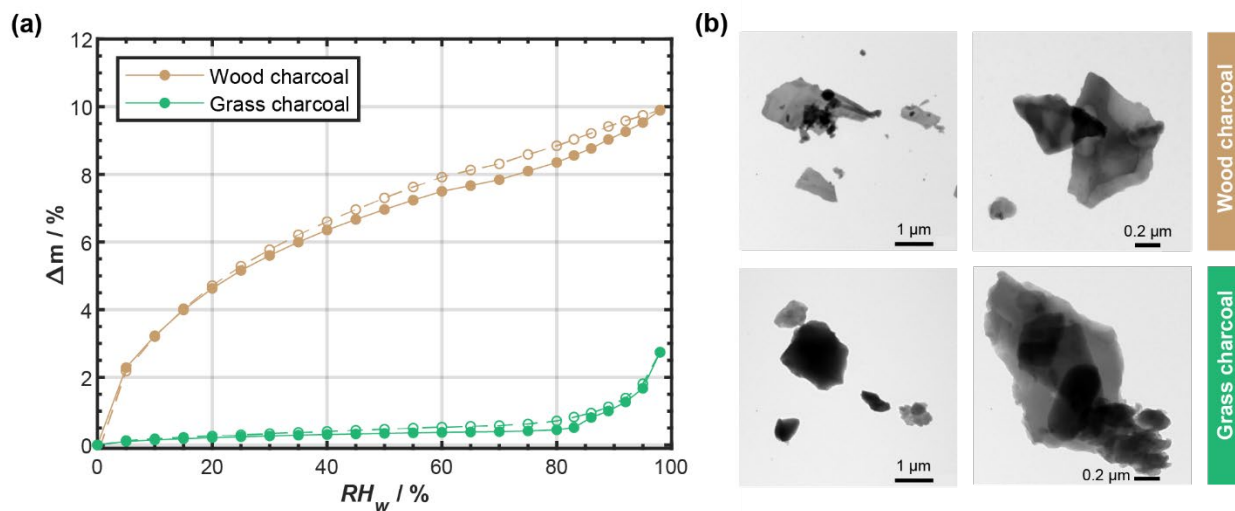


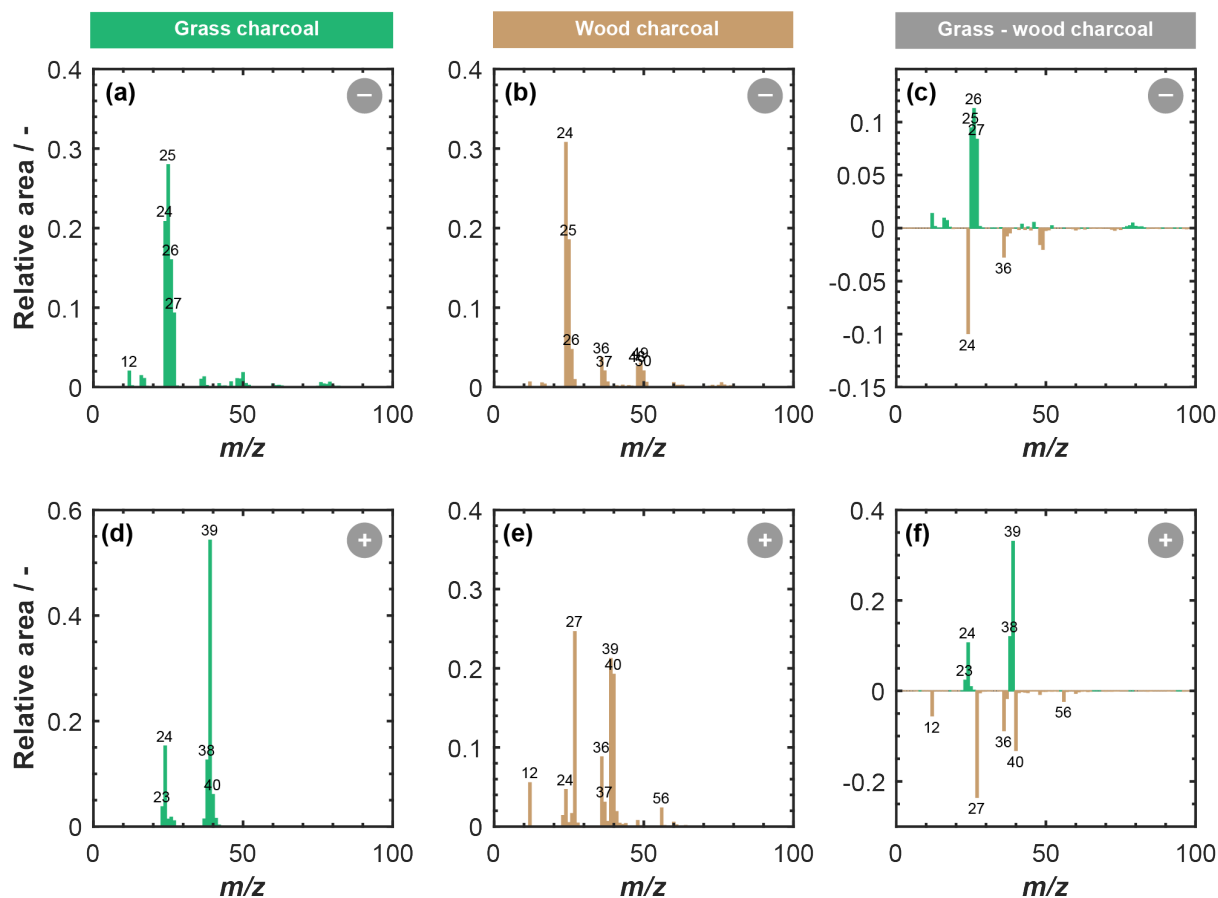
Figure 1: Mean activated fraction (AF) of $d_m = 400$ nm charcoal particles as a function of temperature, as determined with IMCA-ZINC. The grey shaded region indicates homogeneous freezing conditions, ~~as calculated using the homogeneous nucleation rates reported in Iekes et al. (2015) based on Earle et al. (2010).~~ Error bars denote the uncertainty in the activated fraction due to particle counts of the CPC and OPC. Also shown are freezing data for 200 nm ammonium sulfate particles from Hoyle et al. (2011) for reference.



1045 **Figure 2:** Mean activated fraction (AF) as a function of RH_w of the different size selected charcoal particles ($d_m = 400$ nm), as determined from relative humidity scans in HINC for cirrus regime temperatures of (a) 233 K, (b) 228 K (c) 223 K and (d) 218 K. The black, dashed lines represent expected homogeneous freezing conditions according to Koop et al. (2000), and the gray shaded regions indicate the calculated RH_w variation across the aerosol lamina in HINC (Mahrt et al., 2018). Uncertainties are only given for every fifth data point for clarity.

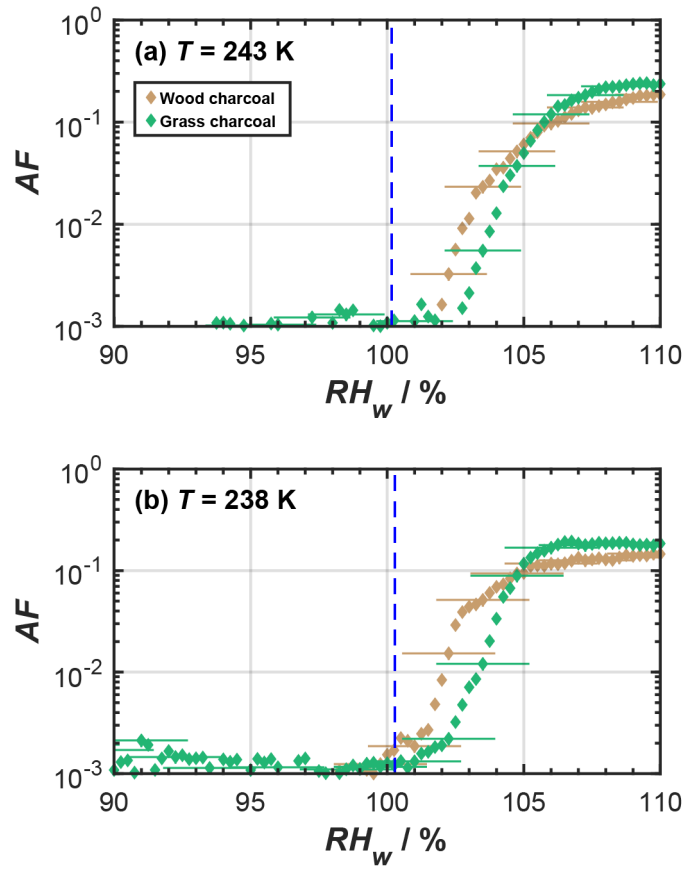


1050 **Figure 3:** (a) Water uptake (solid lines, filled symbols) and loss (dashed lines, open symbols) isotherms given as relative
 1055 sample mass change, Δm , as a function of relative humidity with respect to water (RH_w), as determined by dynamic vapor
 sorption. Sorption isotherms were measured at $T = 298$ K, and the data points represent water up take and loss at quasi-
 equilibrated RH_w conditions. Lines are to guide the eye and uncertainty in Δm is 0.75 %. (b) Example transmission electron
 microscopy images of wood charcoal and grass charcoal.



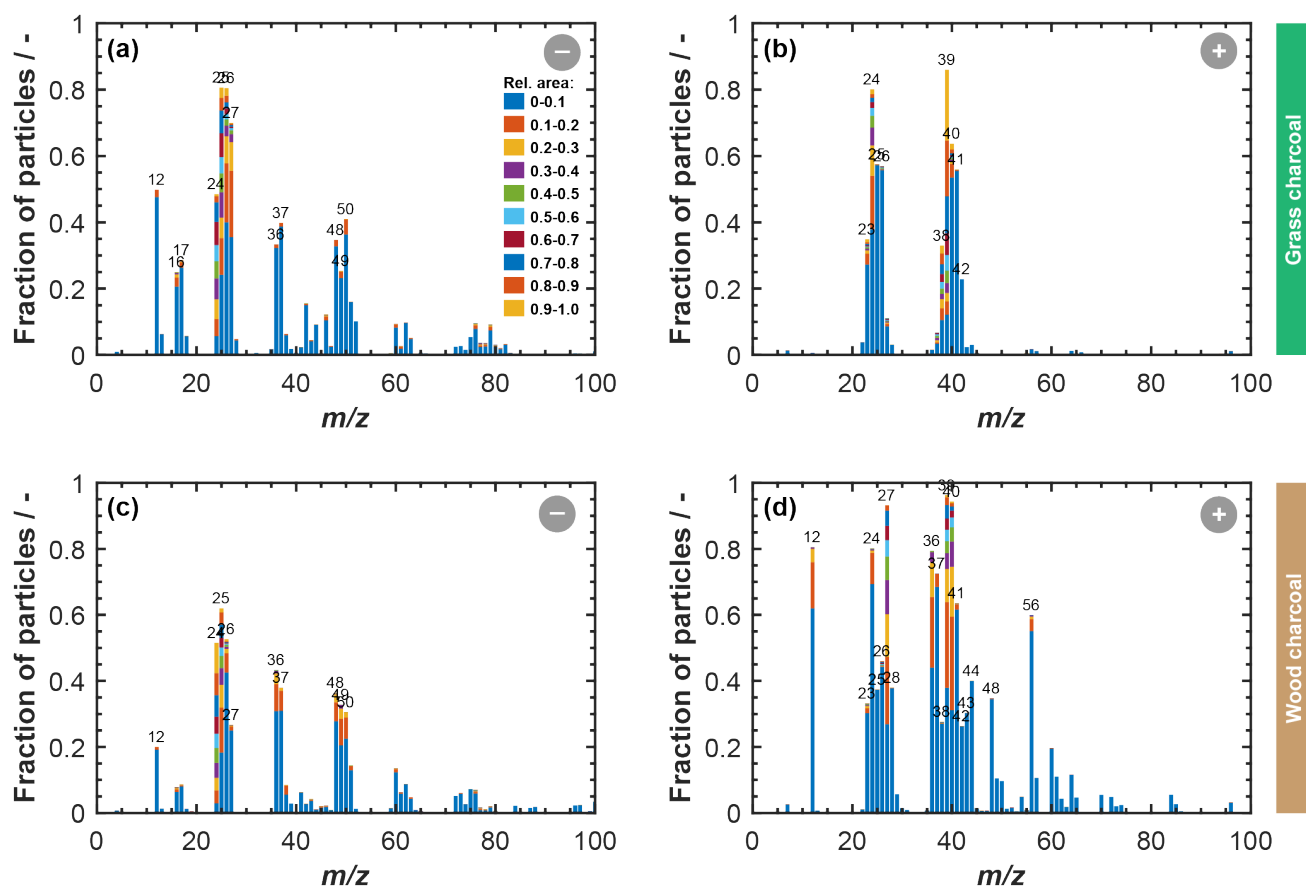
1060 **Figure 4:** Average ATOFMS mass spectra for grass charcoal particles and wood charcoal particles for different polarities:
 1065 negative mass spectra for (a) grass charcoal and (b) wood charcoal; positive mass spectra for (d) grass charcoal and (e) wood charcoal. The panels in the right-hand column compare the two charcoal types and show the difference in relative peak area for the wood charcoal signal being subtracted from the grass charcoal, for anions and cations, respectively. A positive (negative) signal in the panels (c) and (f) corresponds to a larger (lower) relative peak area signal of the respective ions for the grass charcoal compared to the wood charcoal. All spectra are shown in terms of relative peak area and for unit mass resolution. Each single-particle spectrum was first normalized and then the average was calculated over 11'135 (grass) and 12'357 (wood) spectra. Peaks with relative area signals larger than 0.02 are labelled with the corresponding mass to charge (m/z) ratio.

Appendix A: Ice nucleation

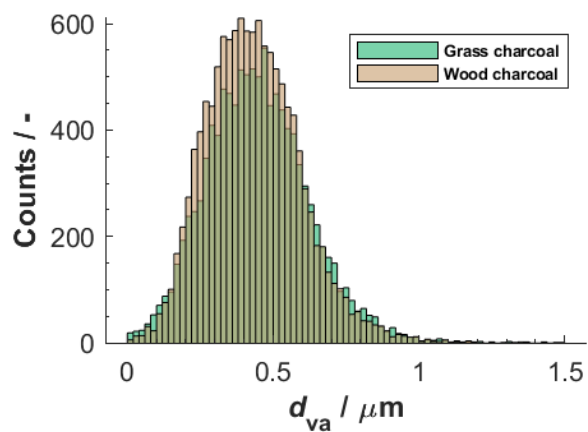


1070 **Figure A1:** Mean activated fraction (AF) as a function of RH_w of size selected charcoal particles ($d_m = 400$ nm), as determined from relative humidity scans in HINC for mixed-phase cloud temperatures of (a) 243 K, (b) 238 K. The blue, dashed lines represent water droplet survival for a particle of initial diameter of 400 nm, a residence (growth) time of 10 s, and assuming pure condensational growth, following Lohmann et al. (2016). Uncertainties are only given for every fifth data point for clarity.

Appendix B: Aerosol time-of-flight mass spectrometry

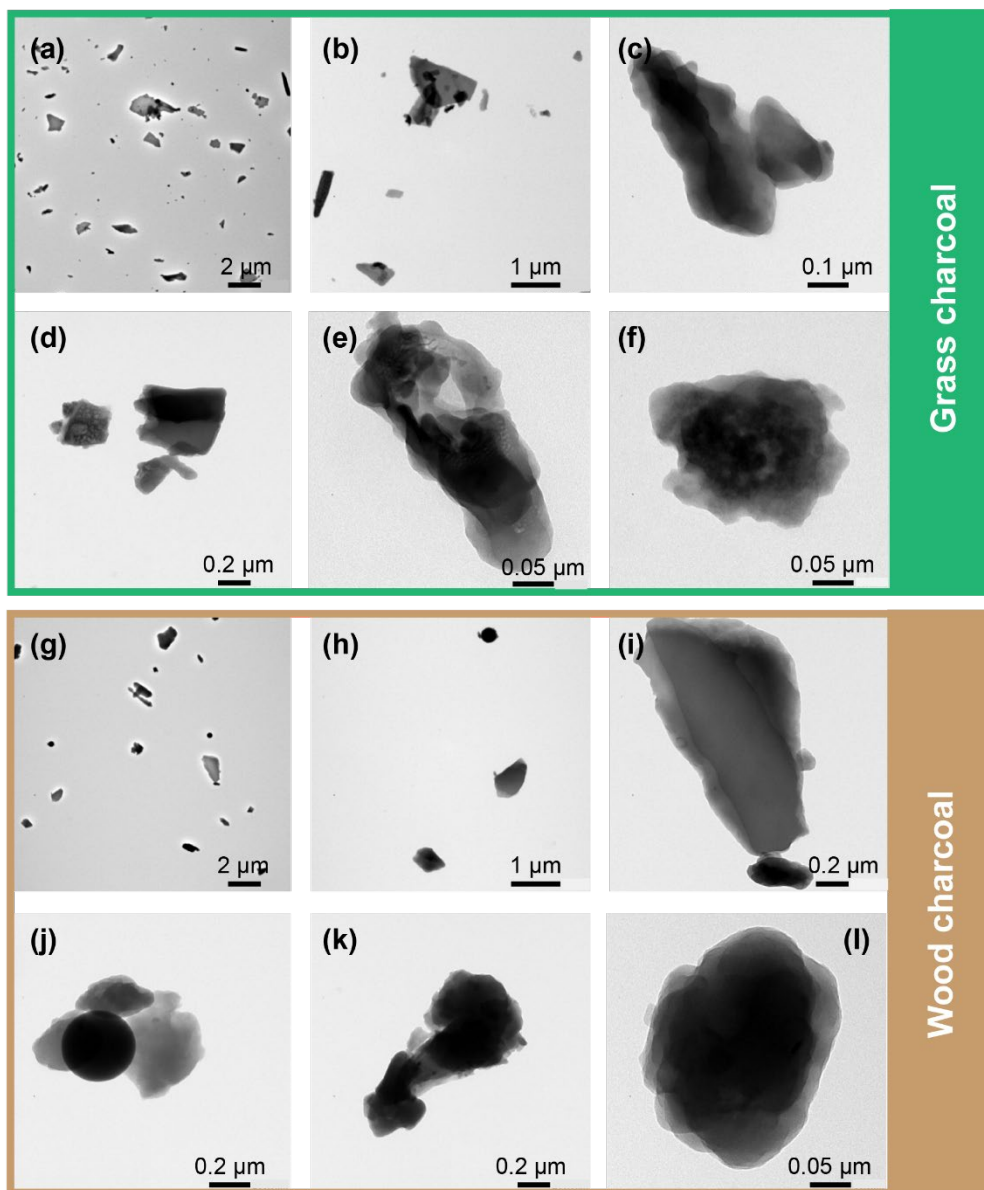


1075 **Figure B1:** Average positive and negative ATOFMS mass spectra for grass charcoal (a, b) and for wood charcoal (c, d). In each panel the mass spectra are shown in terms of the fraction of particles out of all particles of a given charcoal type, that contain a peak with relative peak area values as indicated by the colour code.



1080 **Figure B2:** Histogram of particle size for grass and wood charcoal samples, based on the ATOFMS data, showing the vacuum aerodynamic diameter (d_{va}). Single particle data was binned into 20 nm bins between $0 \mu\text{m} < d_{va} \leq 1.5 \mu\text{m}$.

Appendix C: Transmission electron microscopy



1085 **Figure C1:** Exemplary transmission electron microscopy images of representative charcoal particles, sampled from a polydisperse aerosol population. Images show (a)-(f) grass charcoal particles and (i)-(l) wood charcoal particles, respectively.

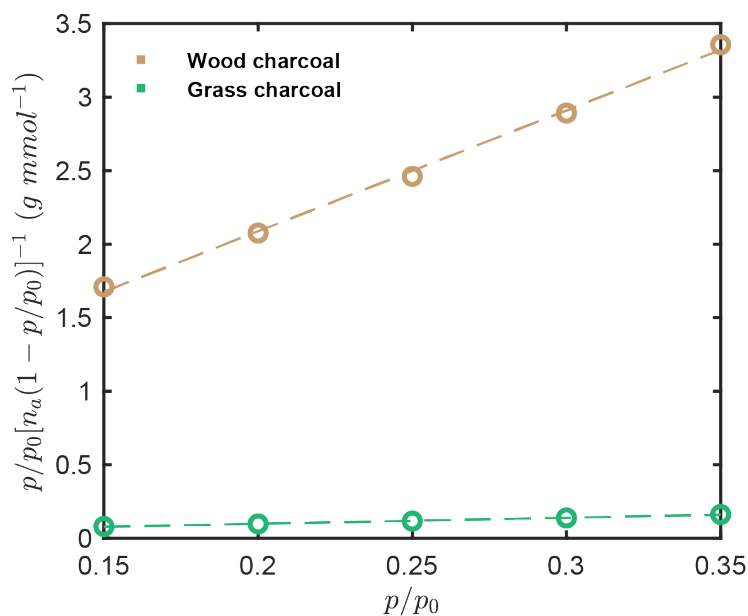
Appendix D: Dynamic vapor sorption

1090 The specific particle surface area was determined from the water vapor adsorption isotherms measured by DVS and using the
BET method. Specifically, the surface area values were determined from the linear BET plot of the H₂O isotherm (Fig. D1)
up to between $p/p_0 = 0.15$ to $p/p_0 = 0.35$, where p is the equilibrium pressure and p_0 denotes the saturation vapor pressure,
assuming a H₂O molecular cross-sectional area of $\sigma_{\text{H}_2\text{O}} = 0.114 \text{ nm}^2$, using the linear form of the BET equation Thommes et
al. (2015):

$$\frac{\frac{p}{p_0}}{n(1-\frac{p}{p_0})} = \frac{C-1}{n_m C} \left(\frac{p}{p_0}\right) + \frac{1}{n_m C}. \quad (\text{D1})$$

1095

Here n is the total amount of water vapor adsorbed on the particles, n_m is the specific monolayer capacity, and C is a constant.
The water vapor-based BET surface areas were determined as $161.3 \text{ m}^2 \text{ g}^{-1}$ and $7.9 \text{ m}^2 \text{ g}^{-1}$ for wood charcoal and grass charcoal,
respectively.



1100

Figure D1: BET plot of the charcoal samples.