



Reviews & Syntheses: Arctic Fire Regimes and Emissions in the 21st

Century

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- 22 **Abstract.** In recent years, the Pan-Arctic region has experienced increasingly extreme fire seasons. Fires in the northern high
- 23 latitudes are driven by current and future climate change, lightning, fuel conditions, and human activity. In this context,
- 24 conceptualizing and parameterizing current and future Arctic fire regimes will be important for fire and land management as
- 25 well as understanding current and predicting future fire emissions. The objectives of this review were driven by policy
- 26 questions identified by the Arctic Monitoring and Assessment Programme (AMAP) Working Group and posed to its Expert
- 27 Group on Short-Lived Climate Forcers. This review synthesises current understanding of the changing Arctic and boreal fire
- 28 regimes, particularly as fire activity and its response to future climate change in the Pan-Arctic has consequences for Arctic
- 29 Council states aiming to mitigate and adapt to climate change in the north. The conclusions from our synthesis are the
- following: (1) Current and future Arctic fires, and the adjacent boreal region, are driven by natural (i.e., lightning) and human-
- 31 caused ignition sources, including fires caused by timber and energy extraction, prescribed burning for landscape management,
- 32 and tourism activities. Little is published in the scientific literature about cultural burning by Indigenous populations across
- 33 the Pan-Arctic and questions remain on the source of ignitions above 70°N in Arctic Russia. (2) Climate change is expected
- 34 to make Arctic fires more likely by increasing the likelihood of extreme fire weather, increased lightning activity, and drier





vegetative and ground fuel conditions. (3) To some extent, shifting agricultural land use, forest-steppe to steppe, tundra-to-taiga, and coniferous-to-deciduous forest transitions in a warmer climate may increase and decrease open biomass burning. However, at the country- and landscape-scales, these relationships are not well established. (4) Current black carbon and PM_{2.5} emissions from wildfires above 50°N and 65°N are larger than emissions from the anthropogenic sectors of residential combustion, transportation, and flaring, respectively. Wildfire emissions have increased from 2010 to 2020, particularly above 60°N, with 56% of black carbon emissions above 65°N in 2020 attributed to open biomass burning - indicating how extreme the 2020 wildfire season was and future Arctic wildfire seasons potential. (5) What works in the boreal zones to prevent and fight wildfires may not work in the Arctic. Fire management will need to adapt to a changing climate, economic development, the Indigenous and local communities, and fragile northern ecosystems, including permafrost and peatlands. (6) Factors contributing to the uncertainty of predicting and quantifying future Arctic fire regimes include underestimation of Arctic fires by satellite systems, lack of agreement between Earth observations and official statistics, and still needed refinements of location, conditions, and previous fire return intervals on peat and permafrost landscapes. This review highlights that much research is needed in order to understand the local and regional impacts of the changing Arctic fire regime on emissions and the global climate, ecosystems and Pan-Arctic communities.

1 Introduction

For more than a decade, climate modeling studies have projected an "invasion" of fires to the Arctic regions (Krawchuk et al., 2009). In this paper, we review the current understanding of the changing Arctic fire regime, and its impacts on fires emissions.

Previous published reviews on fires in the high northern latitudes have linked increasing fire activity in the Arctic and the

Boreal region to climate-driven warming and drying (Hu et al., 2015; Walsh et al., 2020). While fires in the Arctic, defined as

latitudes above 66°N by the Arctic Monitoring and Assessment Programme (AMAP) definition (AMAP, 1998), are not new

(Wein, 1976), a consensus of evidence suggests that tundra fires are increasing (Hu et al., 2015; Masrur et al., 2018) with a

potential for novel fire regimes (Young et al., 2016). Fire regimes are often defined as the main characteristics of fire activity

for a given location: frequency, typical sizes of fires, annual burned area, severity, seasonality, type (surface, ground, or crown

fires), and ignition cause (human or natural) (Hanes et al., 2019).

Over the past four decades, fire activity has increased in Alaska and the Sakha Republic of Russia but decreased slightly in the Northwest Territories of Canada, indicating large spatio-temporal variability of Pan-Arctic fire dynamics (York et al., 2020). Further, in the past three years, there have been large fires in Fennoscandia in 2018, Alaska and Greenland in 2019, and the Russian Federation in 2020, mainly in the Boreal zone, i.e., at and above 50°N, but with expanding fires into the Arctic region (Walsh et al., 2020), even reaching as far north as the Arctic Ocean in eastern Siberia (Kharuk et al., 2021). Thus, quantifying the impact of climate change, human ignition sources, and biophysical parameters, such as availability and/or distribution of

aboveground fuels, permafrost thaw, and drying of peat, on increased fire activity in the Arctic and Boreal are needed to





understand the emerging Arctic fire regime (Krawchuk and Moritz, 2011). Here we define an emerging fire regime in the Arctic as documented increased frequency and lengthened seasonality (both earlier and later) of both natural and human-caused surface and ground fires (i.e., peat) increasing total fire emissions within the Arctic (see Suppl. Table 1 in the Supplement for a list of all key terms).

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Open biomass burning is a known disturbance in the Arctic Council region¹ (AMAP, 2011; 2015). The 2015 Arctic Monitoring and Assessment Programme (AMAP) assessment on black carbon (BC) and ozone as Arctic climate forcers noted key characteristics of open biomass burning in the Arctic region, including human influence on both ignition and fuels management, significant interannual variation of fire events and emissions, spatial and seasonal clustering of burning related to active land management, and fuel conditions (AMAP, 2015). Since 2015, evidence of direct climate change influence on large, early season fires has increased (Wang et al., 2017) as well as fueling extreme wildfires at the wildland-urban interface (WUI) and not just remote Boreal forests and Arctic tundra (Abatzoglou and Williams, 2016; Kirchmeier-Young et al., 2019). In terms of burned area, 2015 was the largest fire year for the Alaskan tundra ecoregion (Michaelides et al., 2019).

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Under future climate change, an overall increase in fires is expected in the Arctic Council region, indicating that associated emissions are also likely to increase. For instance, natural fires, defined as lightning-caused fires, may increase as lightning is predicted to increase (Púčik et al., 2017; Veraverbeke et al. 2017; Bieniek et al., 2020), under Representative Concentration Pathways (RCPs) 4.5 (stabilising emissions) and 8.5 (high emissions) developed for the Intergovernmental Panel on Climate Change (IPCC) Fifth Assessment Report (AR5). Likewise, using the same scenarios, wildfire emissions of BC, CO, NO_x, PM_{2.5}, and SO₂ could exceed anthropogenic emissions in northeastern Europe, including Sweden and Finland, by 2090 (Knorr et al., 2016). There is a clear consensus that the emerging Arctic fire regime will be marked by shifts in fire seasons, i.e., likelihood of extreme fires later in the growing season, will occur in the Boreal forests of eastern Canada (Boulanger et al., 2013); central and northwestern Canada (Boulanger et al., 2014); and European Russia, West Siberia, and the Far East (Sherstyukov and Sherstyukov, 2014). By the end of the 21st century under RCP6.0 (stabilising emissions with higher CO2 equivalency than RCP4.5), the annual chance of large tundra fire in Alaska will be almost one in four, i.e., a range of 13-23% predicted increases (Hu et al., 2015). Moreover, Wang et al. (2017) noted that a recent lengthening in the fire season in Canada has led to the increase in the total number of fire spread days, leading to large increases in total fire size and emissions for early season fires like the Fort McMurray megafire in Alberta. Lengthening the fire season, a component of the emerging Arctic fire regimes, means increased potential for more and larger fire emissions throughout the fire season, starting earlier in spring and lasting later into autumn.

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¹ The Arctic Council membership comprises the eight member states: Canada, the Kingdom of Denmark, Finland, Iceland, Norway, the Russian Federation, Sweden, and the United States of America, as well six permanent participants representing Arctic Indigenous peoples, including the Aleut International Association, the Arctic Athabaskan Council, the Gwich'in Council International, the Inuit Circumpolar Council, the Russian Association of Indigenous Peoples of the North, and the Saami Council.





For the past two decades, it has been well established that understanding fire regimes improves emission estimates from fires in high northern latitudes (Conard and Ivanova, 1997; Soja et al., 2004a) and may even be necessary for creating emission models (van der Werf et al., 2010). Further, climate change is expected to alter fire regimes and likely increase emissions (Sommers et al., 2014). For that reason, this review also includes emission estimates from adjacent boreal fires as well as temperate fire sources known to impact the Arctic region via increased atmospheric abundance and deposition of black carbon as well as greenhouse gas emissions. This review paper spawned from policy questions (Table 1) that the Expert Group on Short-Lived Climate Forcers (SLCF EG) of AMAP, a Working Group of the Arctic Council, was asked to answer for its 2021 Assessment Impacts of short-lived climate forcers on Arctic climate, air quality, and human health (AMAP, 2021). Our specific objectives are to (1) identify and review the key drivers of the Arctic fires today and in the future to characterise an emerging Arctic fire regime, with potential changes; (2) characterize fire emissions from ground- and satellite-based data sources in the Arctic, boreal, and temperate regions that impact the Arctic; (3) contextualize emissions from the Arctic fire regime with other sectoral sources for the Pan-Arctic; and (4) identify key challenges and research questions that could improve understanding, monitoring, and management of Arctic fires in the 21st century. We focus on SLCF emissions but note that wildfires are also a source of CO₂ and other contaminants of environmental and human health concern in the Arctic, including mercury and polycyclic aromatic hydrocarbons (PAH).

2 Drivers of Arctic fire regimes

For this review paper, the definition of open biomass burning in the Arctic will include wildland fires (i.e., wildfires, forest fires, peat fires) and fires in human-dominated landscapes (i.e., agricultural open burning, prescribed burning). Given the strong influence of boreal systems on the Arctic in terms of fire disturbance, emissions, and shifting vegetation, we have included boreal fire regimes in this review, while specifically identifying each climatic zone as needed. Broadly speaking, wildfires are driven by climate and weather, fuels and fuel conditions, and ignition sources (Silva and Harrison, 2010; de Groot et al., 2013). Human-caused fires are driven by fuels management to reduce fire risk, land management in agricultural and timber landscapes, and cultural practices (Granström & Niklasson, 2008; Bowman et al., 2020).Pollen-based reconstructions show prehistoric and early historic human settlements increased during wetter climates in Minusinsk Hollow in south-central Siberia, where grain and pasture yields increased twofold, rather than dry periods that favoured pastoralist (Blyakharchuk et al., 2014), highlighting the dependence of human-dominated landscapes and fire on climate. Reported statistics and geospatial methods from Earth observations were used to quantify and differentiate open biomass burning as human-caused fires, i.e., agricultural open burning, timber and agroforestry, and natural fires, i.e., lightning-caused fires. Fire risk, or the likelihood of a fire occurring, in the Arctic region is often driven by climate and fire weather, fuel type, availability, and condition, and presence of people as ignition sources (more in Suppl. Table 1).



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Ignition from lightning strikes, fire weather (i.e. temperature, humidity and wind), and fuel conditions (moisture) are the typical controlling processes for 'natural' fires, i.e. fires not caused directly by human activity. End of century modeled fire-climate interactions under RCP6.0 for Alaska showed summer temperatures and annual precipitation are the most important climatic factors driving the likelihood of new wildland fire regimes in tundra and the boreal forest-tundra boundary (Young et al., 2016). Burned area is predicted to increase 40 to 50% in the high latitudes under climate-forcing scenario 8.5 given modeled changes in fuel loads, fuel moisture, and increased lightning frequency (Krause et al., 2014). Increased convective cloud formation has been documented in the Russian Arctic (Chernokulsky and Esau, 2019) and the North American boreal forest (Veraverbeke et al., 2017), with a 5% increase in convective storms in Northern Europe projected by the end of the 21st century under RCPs 4.5 and 8.5 (Púčik et al., 2017). In general, lightning frequency is expected to increase over areas north of 50°N. The strongest projected relative increase is approximately 100% across northern Europe under RCP 8.5 scenario by the end of the century (Groenemeijer et al., 2016). Moreover, since summers are expected to become drier in the future (Venäläinen et al., 2020), the role of lightning as an ignition source for wildfires may increase for northern Europe. These future models agree with observations of past natural fires in the Arctic region. Paleofire meta analysis of boreal biomass burning during the Holocene (4,000 to 200 years BP) for the boreal zone of North America and Fennoscandia show general trends in boreal biomass burning were primarily controlled by climatic changes, mainly mean annual precipitation in Alaska, northern Quebec, and northern Fennoscandia and summer temperatures in central Canada and central Fennoscandia (Molinari et al., 2018). Boreal needleleaf evergreen fuel composition at the landscape-level across Alaska and central and southern Fennoscandia was secondary to climatic controls. These paleofire results align with recent findings by Walker et al. (2020), showing fine-scale drainage conditions, overstory tree species composition, and fuel accumulation rates across 417 sites in boreal and taiga ecoregions of northwestern Canada and Alaska were more important that incidental fire weather in terms of fire severity and subsequent carbon emissions.

152 in the Arctic as climate change expands human-dominated landscapes northward, increasing potential ignition sources (Fig. 153 154 155 156

1). The 2019 Greenland wildfire, which consumed surface vegetation and high carbon soils for nearly a month, was caused when a campfire ignited dry ground near a public camping site of the world-renowned Arctic Circle Trail (McGwinn, 2019), indicating that tourism will need to adapt to increased fire risk in tundra landscapes. Greenland wildfires in 2017 and 2019 occurred east of Sisimiut in tundra areas with low vegetative cover and degraded permafrost, but high carbon soils, during warm, dry, and sunny summers (Evangeliou et al., 2019). Timber extraction and site preparation currently cause large wildfires in the Arctic Council region, including the 2014 Västmanland fire in Sweden (Lidskog et al., 2019), which actively burned for 18 days creating a burn scar of over 14,000 ha (Pimentel and Arheimer, 2021). Northward agricultural expansion will likely increase human-caused open burning as wheat and maize establish in previously permafrost areas of West Siberia (Parfenova et al., 2019), expanding into the cold regions of the boreal zone (King et al., 2018) and nearing the Arctic Circle for Central

Open biomass burning from anthropogenic activities like agriculture, timber, and energy extraction are expected to increase

Siberia (Tchebakova et al., 2016). Of course, the northward agricultural expansion will also be dependent on local and/or in-





situ conditions limiting its expansion, such as inferior soils, existing land uses not compatible with agricultural conversion, and topographic limitations (Ioffe and Nefedova, 2004; Dronin and Kirilenko, 2011; Tchebakova et al., 2011).

3 Climate change and future Arctic fire activity

Many future fire modelling approaches use greenhouse gas emission scenarios to project the impact of climate change on future temperature and precipitation - both influencing fuel ignition and subsequent burning (Veira et al., 2016). Increased fire risk will not be uniform across the Pan-Arctic (Fig. 1). For instance, permafrost thaw will lead to a rewetting of soils (Wrona et al., 2016), reducing above-ground and below-ground fire risk. Boike et al. (2016) increasing areas of thermokarst lakes were not coincident with areas of increasing fire in central Sakha Republic. Further, changing precipitation regimes in the form of more rainfall in the Arctic for the months of March through December by end of century using RCP8.5 projections (Bitanja and Andry, 2017) could both reduce fire risk through increased wetness but also increase fire risk through more vegetation growth and/or shifting fuels regimes.

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Fig. 1 depicts transition themes and associated fire risks taken from the scientific literature, with general locations on the map derived from the locations of these studies. These ecological and meteorological studies rely on gridded climate scenarios from future greenhouse gas emission scenarios in order to predict fire risk for mid- (2050) and late-century (2100). First, as boreal forests experience permafrost thaw, where initially wet soils (Wrona et al., 2016; O'Neill et al., 2020) are followed by increasingly dry ground fuels (Turetsky et al., 2015; Box et al., 2019). Topography plays a crucial role in determining shifting habitats, where drying will dominate on tilted surfaces and bogging will dominate on flat terrain (Tchebakova et al., 2009). The Siberian Arctic tundra is dominated by relatively flat terrain, consequently bogging is predicted to prevail. Second, anticipated transitions of boreal forest to deciduous forest stands would decrease fire risk in eastern Canada and small regions of interior Alaska (Terrier et al., 2013; Foster et al., 2019; Mekonnen et al., 2019). Third, expansion of grassland ecosystems is predicated in northwestern Canada and Alaska (Wang et al. 2019; Whitman et al., 2019) and Siberia (Tchebakova et al., 2009, 2016). Fourth, increased lightning strikes will in turn increase fire risk in Alaska (Veraverbeke et al. 2017) but also northern Europe (Púčik et al., 2017). Fifth, the interaction between climate-driven changes in fire regimes and permafrost will compel a decrease in and a northern migration of Siberian taiga, which will result in the transition of tundra to taiga in northern Siberia (Tchebakova et al., 2009, 2011; Sizov et al., 2021). Permafrost is not predicted to thaw deep enough to sustain darkneedled taiga (Pinus sibirica, Abies sibirica, and Picea obovata), nonetheless light-needled Larix is predicted to continue to dominate in eastern Siberia. Sixth, forest-steppe and steppe is predicted to dominate over half of Siberia, largely forced by climate and increases in fire regimes (Tchebakova et al., 2009). Seventh, northward agricultural expansion may increase human-caused agricultural burning as wheat and maize (silage) establish in previously permafrost areas of East Siberia (Tchebakova et al., 2009; Parfenova et al., 2019), expanding into the cold regions of the boreal zone (King et al., 2018) in North America as well. Finally, a threefold increase of permafrost thaw in the boreal zone under RCP4.5 by 2100 is likely to





increase the amount of peat fuels available for burning (Nitzbon et al., 2020). As stated earlier, climate warming can cause more ignitions from lightning (Veraverbeke et al., 2017) and degraded permafrost due to increasing dry ground fuels that can increase fire severity (Teufel and Sushama, 2019). Using the RCP8.5 scenario, Teufel and Sushama (2019) estimate that a 2.0°C global threshold in temperature increase, which could be reached around 2031, may cause 42% of pan-Arctic permafrost to abruptly degrade and increase fire severity in Russia, Canada, and Alaska. Surface fires can cause permafrost to thaw, producing thermokarst lakes (Jones et al., 2015), which previously have been considered to reduce fire risk (Sofronov et al., 2000) but are not perfect fire breaks as wildfires can "jump" (Sofronov and Volokitina, 2010). By the end of the century, wildland fire risk is expected to increase, with length of fire seasons - measured in terms of daily severe fire weather occurrence - predicted to expand by as much as 20 days globally (Flannigan et al., 2013). Similarly, Sherstyukov and Sherstyukov (2014) predict an increase of > 50 days of high fire risk days by 2100 for Russia under RCP 8.5 scenario, with a potential to double annual forest fire burned area. Using CMIP5 model intercomparisons, Lehtonen et al. (2016) estimate large (≥ 0.1 km2) boreal forest fires in Finland to increase by 1.9 times under RCP4.5 and 2.3 times under RCP8.5 by mid-century. Robust predictions of future burned area in wildland and human-dominated landscapes for the Arctic require an understanding and quantitative simulation of the major drivers of fire (specifically climate and fire weather, ignition, fuels, and humans), including coupled dynamics between and among these drivers (Riley et al., 2019).

3.1 Climate change will increase number of natural fires

The boreal and Arctic landscape is diverse, and thus so are natural fires, spanning from forests to grasslands and peatlands. Near-term warming means more ignitions from lightning (Veraverbeke et al., 2017) and degraded permafrost increasing dry ground fuels, including peat (Turetsky et al., 2015), and fire severity (Teufel and Sushama, 2019). By the end of the century, wildland fire risk is expected to increase, with length of fire seasons - measured in terms of daily severe fire weather occurrence - predicted to expand by as much as 20 days for high northern latitudes using the A1B (roughly corresponding to RCP6.0), A2 (~ RCP8.5), and B1 (~RCP4.5) scenarios (Flannigan et al., 2013). Similarly, Sherstyukov and Sherstyukov (2014) predict an increase of > 50 days of high fire risk days for Russia under RCP8.5 scenario, with a potential to double annual forest fire burned area by 2100. Using CMIP5 model intercomparisons, Lehtonen et al. (2016) found that large (≥ 0.1 km) boreal forest fires in Finland may double or even triple by the end of century, using RCP4.5 and RCP 8.5 scenarios, but with large intermodel variability. Robust predictions of future burned area in wildland and human-dominated landscapes for the boreal and Arctic require an understanding and quantitative simulation of the major drivers of fire (specifically climate and fire weather, ignition, fuels, and humans), including coupled dynamics between and among these drivers (Riley et al., 2019).

The climate-induced vegetation shifts, which would also modify fire risk and related emissions, present a complex matrix for the Arctic Council member states. Predictions of boreal forest transition to deciduous forest stands would decrease fire risk in eastern Canada and interior Alaska (Terrier et al., 2013; Foster et al., 2019; Mekonnen et al., 2019). Wang et al. (2019) found





that these trends are already occurring in Alaska and Northwestern Canada using three decades of Landsat imagery with a 30 m resolution, as climate drives grass and shrub expansion in the Arctic and wildfires drive most of the evergreen forest reduction and expansion of deciduous forests in the boreal. Further work in mature deciduous forests of Interior Alaska show that current canopy "gaps" are related to ecological shifts to evergreen shrubs, lichens, and mosses, thus increasing overall fire risk due to presence of these high flammability coniferous species in these small areas within low flammability deciduous stands (Alexander and Mack, 2017). Further, moderate to high spatial and temporal resolution satellite mapping of taiga-tundra vegetation show an northern expansion of trees, but with complex patterns of diffuse and abrupt transitions from forests to non-forests (Montesano et al., 2020).

There is a consensus that prolonged fire seasons will become more common, increasing in the eastern boreal forests of Canada (Boulanger et al., 2013); central and northwestern Canada (Boulanger et al., 2014); and European Russia (particularly the Republic of Karelia and Leningradskaya oblast), West Siberia, and the Far East (Tchebakova et al., 2009; Sherstyukov and Sherstyukov, 2014). Wang et al. (2017) note that recently the fire season in Canada is characterized by more total number of fire spread days, leading to large increases in total fire size and emissions for early season fires like the Fort McMurray megafire in Alberta, which burned both forests and peatlands and was caused by humans (Hanes et al., 2019). Lengthening the fire season means increased potential for more and larger fire emissions throughout the fire season, starting earlier in spring and lasting later into autumn. Further, suppression of wildfire in Canadian boreal communities has increased their likelihood of flammability, allowing fuels to build up in and near populated places (Parisien et al., 2020), calling into question what other wildland-urban interfaces in the Arctic region may have similar risks due to long term aggressive fire suppression. Ignition likelihood is often modeled by considering the moisture conditions of ground fuels (i.e., litter) and the organic layer (i.e., forest canopy), whereby humans are the most likely source of fire on the ground and lightning the source for canopy fires (Wotton et al. 2003). Veraverbeke et al. (2017) introduced a positive feedback loop between climate, lightning, fires and northward forest expansion, whereby surface energy fluxes from forests appeared to be increasing the probability of lightning in Alaska.

Climate change may have both positive and negative impacts on boreal forests and forestry (Reyer et al., 2017). Moreover, fire regimes and related changes in spring albedo (relative reflectance) and the radiation balance are distinct in North American (crown-fire dominated) and Northern Eurasian (surface-fire dominated, smaller negative shortwave forcing) systems (Rogers et al., 2015). In the near future, these changes may be positive but become negative in the mid- and long-term. In general, climate change accelerates forest growth at high northern latitudes due to a longer growing season. Moreover, elevated CO₂ concentration decreases transpiration and increases photosynthetic rate and thus enhances forest growth (Peltola et al., 2002; Kellomäki et al., 2018). However, abiotic and biotic damages in particular may have opposite effects on forest growth (Seidl et al., 2014). For example, drought increases the risk of forest fires, but also negatively impacts the growth of Norway spruce (*Picea abies*) and exposes trees to biotic damages. Snow damages are estimated to increase in northeastern Europe but decrease elsewhere in Europe by end-of-century under RCP scenarios 4.5 and 8.5 (Gronemeijer et al., 2016). Wind damage risk is



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expected to increase due to the shortening of soil frost period (Venäläinen et al., 2020). Many forest insects responsible for bug kill of trees will benefit from climate change due to established linkage of increased habitat range and increased winter temperatures (Pureswaran et al., 2018). Climate-driven bug kill increases the amount of easily burnable material in forests and can influence fire risk. For example, a large-scale bark beetle invasion could increase the amount of fuels via dead wood, increasing ignition risk and crown fire risk as well as increasing the need, danger, and cost of fuels and fire management of insect attacked forests (Jenkins et al., 2014). According to Venäläinen et al. (2020), a warming climate is likely to increase the risk of bark beetle outbreaks and wood decay caused by Heterobasidion spp. root rot in Finland's coniferous forests. Siberian forests have already experienced a northern progression of the destructive Siberian moth (*Dendrolimus sibiricus* Tschetvericov) by a distance of ~ 0.5 degree and a decrease in the regeneration cycle from two to one year, prompted by drought and increasing temperatures (Baranchikov and Montgomery, 2014; Kharuk et al., 2017). Moreover, the probability of forest-damaging cascading and compounding events, i.e., large-scale wind damage followed by a widespread bark beetle outbreak, may increase remarkably in the future for the High Northern Latitudes. Future climate conditions are expected to become more favourable for forest fires in the boreal zone, even in highly managed regions.

3.2 Climate change will increase number of non-forest fires

Under RCP8.5, Stralberg et al. (2018) estimated that by 2100, grasslands will replace much of the upland conifer, mixed forests, and deciduous forests for a large area of the boreal forest zone of northern Alberta. Shorter fire return intervals combined with climate change-induced drought will reduce the resiliency of evergreen and broadleaf species to re-seed and/or establish after wildfires, leading to expansion of grassland ecosystems in what is now Northern Canadian forests (Whitman et al., 2019). Increased grass-dominated landscapes would create a new fire regime of frequent but low severity fires, with the likelihood of SLCF transport to the Arctic most likely in the spring months of March through May (Hall and Loboda, 2018). Grassland fires produce less energy, with smoke plumes more similar to crop residue burning, and are unlikely to breach the tropopause for consistent, year-round transport of smoke to the Arctic (Hall and Loboda, 2017), unlike the current observed deposition from boreal forest fires in the Arctic (Thomas et al., 2017). Further, Smirnov et al. (2015) found forest fires in European Russia during 2008-2012 occurred mainly in June and August, with Siberia and the Russian Far East being the main sources of BC emissions during a time when transport to the Arctic is unfavourable. In the Sakha Republic, Kirillina et al. (2020) found that from 2011 onwards, fire seasons have been 13 days longer than previously, on average, and starting from 2009 onwards, fire seasons have started earlier in April, sooner than previous years. A peak fire occurrence across a threemonth period of May to July persists in Sakha. During the 2020 extreme fire season in Siberia, high resolution satellite data from the European Space Agencies' Sentinel-2 detected fires around still-frozen thermokarst lakes above 70°N (McCarty et al., 2020). This indicates that BC from early season burning in and near Arctic Siberia could be available for transport, and thus deposition on snow and ice that accelerates melting as well as associated climate feedback due to effect on albedo. Given this, early season fires are particularly relevant because Arctic snow and sea-ice coverage are much more widespread in the



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early burning season than late season. Emission factors for biomass burning in grassland and steppe ecosystems are generally smaller from those of boreal forests (Akagi et al., 2011; Andreae, 2019), which potentially implies different impacts on atmospheric chemistry and SLCFs. Therefore, while boreal forest fires emit more SLCFs than grasslands and cropland fires, the springtime burning of northern grasslands, peatlands, and croplands - often human-caused - means these emissions are more likely to be transported to the Arctic than summertime forest fires.

4 Arctic fire emissions

In Section 4 and 5, we present new emissions work that builds on the 2015 AMAP assessment of BC and ozone (AMAP, 2015), which included 2005 biomass burning emissions from an the Global Fire Assimilation System (GFASv1.2; Kaiser et al. 2012), Global Fire Emissions Database version 2 (GFEDv2; van der Werf et al. 2006), GFEDv3 (van der Werf et al. 2010), the Global Inventory for Chemistry-Climate studies (GICC; Mieville et al. 2010), MACCity (Lamarque et al. 2010), and the Fire Inventory from NCAR (FINNv1.5; Wiedinmyer et al., 2011) for above 60°N. For the 2021 AMAP assessment, we focused on longitudinal biomass burning emission models for years 2005 through 2018 using the Global Fire Emissions Database with small fires (GFEDv4s; van der Werf et al., 2017), FINNv1.5 (Wiedinmyer et al., 2011), GFASv1.2 (Kaiser et al., 2012), the Quick Fire Emissions Dataset (QFEDv2.5r1; Koster et al., 2015), and the Fire Energetics and Emissions Research (FEER; Ichoku and Ellison, 2014). These versions of GFAS, GFED, FINN, FEER, and QFED analyzed rely on Moderate Resolution Imaging Spectroradiometer (MODIS) thermal anomalies, with GFEDv4s integrating the MCD64A1 burned area product with the MODIS active fire product to account for small fires. It should be noted that the MCD64A1 algorithm used in GFEDv4s embeds the MODIS active fire data to seed burned area detection and growth (Giglio et al., 2009). For each global fire emissions model, the area of interest was defined roughly as 45° to 80° North (N) globally, split by latitude ranges of 45° to 50° N: Temperate, 50° to 60° N: boreal, 60° to 70° N: Low Arctic, and 70° to 80° N: High Arctic. Average annual emissions from open biomass burning from all sources (agriculture, boreal forest, tundra, peat, etc.) were calculated for 2005-2018 for BC, methane (CH₄), carbon monoxide (CO), and fine particulate matter (PM_{2.5}).

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Since the Visible Infrared Imaging Radiometer Suite (VIIRS) provides daily, global observations of low-intensity fires (Johnston et al., 2018), a custom AMAP open biomass burning emissions inventory was developed for the year 2018 to utilize VIIRS's capabilities to detect smouldering fires which are common in peat landscapes. Suomi-NPP VIIRS active fire from day and night detections (Oliva and Schroeder, 2015) were assumed to completely burn each 375 m² pixel. A 'best-guess' land cover was created from three different land cover products, with a sample (n = 30 locations) validation of land cover type performed for each country. Ultimately, the 750 m VIIRS Surface Type land cover product (Zhang et al., 2018) was used for North America, Greenland, and the Russian Federation, augmented by the revised 1 km Circumpolar Arctic Vegetation Map (Raster CAVM; Raynolds et al., 2019) for missing values in the high northern latitudes. For Norway, Sweden, and Finland, the 10 m Land Cover Map of Europe 2017 from the Sentinel-2 Global Land Cover Project (Gromny et al., 2019) was used.





All land cover maps were reclassified into the International Geosphere-Biosphere Program (IGBP) classes for ease of emission calculations. Fuel loadings and combustion completeness were taken from Van Leeuwen et al. (2014), with tundra values used for Greenland. Emission factors were taken from Akagi et al. (2011), with updates from Andreae (2019).

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Most fire activity and emissions occur between 50° and 60° N, with very few open biomass burning emissions between 70° and 80° N and zero satellite observations of fire above 80° N (Fig. 2). The latitude band of 50° to 60° N corresponds to the southern extents of the boreal region, an area experiencing increasing fires due to climate change (de Groot et al., 2013) and includes the largest wildfires in British Columbia's history, burning 1,200 km² in summer 2017 (Kirchmeier-Young et al., 2019). Note also that fire activity detected by the 1km MODIS MCD14 Collection 6 active fire data (Giglio et al., 2016), with confidence values > 50%, has a positive trend for fires occurring between 60° and 70° N, but not for the latitude bands of 45° and 50° N or 50° and 60° N (Fig. 2).

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In the 14-year emissions estimates from GFAS, GFED, and FINN, a clear shift has occurred in the zonal distribution of fire since the mid-2000's. More fire is now taking place north of 60° N than in the temperate zone of 45° to 50° N, where large amounts of human-caused burning and wildfires throughout North America, Europe, and Eurasia occur (Fig. 2). This trend is more pronounced in GFED and GFAS than in FINN, though all models show a positive trend (note the dotted line in Fig. 2). The 2005 to 2018 multi-model annual average BC emissions from all open biomass burning sources in the Arctic (60° to 80° N) and adjacent regions known to impact smoke transport into the Arctic (45° to 60° N) is 0.34 Tg. The years with the highest multi-model average are 2012, 2008, and 2015 with BC emissions of 0.45 Tg, 0.44 Tg, and 0.41 Tg, respectively. The lowest annual average BC emission from the five global fire emissions models are 2008 and 2013, with 0.27 Tg. The fire emissions model with the consistently highest BC emissions is QFED, with an annual average of 0.68 Tg (Fig. 3). FEER, GFAS, and GFED have more agreement, with annual BC emission averages of 0.32 ± 0.07 Tg, 0.30 ± 0.07 Tg, and 0.25 ± 0.06 Tg, respectively. FINN has the lowest annual average BC emissions of 0.130 Tg, with higher emissions in 2012 (0.20 Tg) and 2008 (0.19 Tg). The AMAP model designed specifically for the Pan-Arctic, which was based on VIIRS active fire data and region-specific land cover types, produced slightly higher emission estimates than FINN (Fig. 3) for year 2018. The AMAP model predicts BC emissions of 0.13 Tg and CH4 emissions of 1.39 Tg, compared to FINN's 0.11 Tg of BC and 1.19 Tg of CH₄. Compared for 2018 only, GFED has marginally higher BC emissions than GFAS, while methane emission estimates from GFAS are substantially higher than GFED.

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Ground-based official statistics vary greatly by country or sub-region (i.e., Alaska and Greenland) for circa 2019 (Table 2). Suppl. Table 2 provides the emission variables used to calculate emissions for each country or sub-region of the Pan-Arctic reporting official burned area statistics. The Russian Federation has the highest burned area, with over 100,000 km² burned. In 2019, open biomass burning in European Russia - comprising Northwestern, Central, Southern, North Caucasus, and Volga Federal Districts - accounted for only 190 km² of burned area (ΦБУ "АВИАЛЕСООХРАНА", 2019). Approximately 98.2%





of burned area in Russia occurred in the Urals, Siberia, and Far East Federal Districts. In general, Greenland, Fennoscandia, and European Russia are the regions with the lowest burned area and open biomass burning emissions, with all regions experiencing the most burning in 50° to 60°N and the second most burning in the latitudinal band of 60° to 70°N. Alaska and Canada account for approximately 29,000 km² of total pan-Arctic biomass burning and 17% of the BC emissions, while the contiguous United States (CONUS) accounted for 24% of BC emissions. It should be noted that while Canada and CONUS reported similar official statistics for burned area, fires in temperate zones of the CONUS tend to emit double the emissions of boreal ecosystems (Table 2). Greenland is a novel fire regime in the Arctic, with two relatively substantial wildfires in 2017 and 2019, that accounted for more burned area and emissions than Norway or Finland. In 2019, the majority of open biomass burning and related emissions for the Arctic Council member states originated in Siberia and the Russian Far East, followed by the CONUS, Canada, and Alaska.

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Focusing on a potentially novel Arctic fire regime in Greenland allows us to localise the impact of fires on deposition and ice, and what that may hold for the future. Unusual fires were observed in western Greenland by pilots and also confirmed by satellites between 31 July and 21 August 2017, after a period of warm, dry and sunny weather. The largest wildfire grew to approximately 22 km² in size, eventually extinguished by rain (Cartier, 2017). The fires burned > 20 km² of high carbon soils - potentially peat due to smouldering and fire spread behaviour - that became vulnerable due to permafrost degradation (Daanen et al., 2011). Work by Evangeliou et al. (2019) estimated the 2017 wildfire consumed a fuel amount of about 0.12 Tg of Carbon (C) and emitted about 0.00002 Tg of BC and 0.0007 Tg of Organic Carbon (OC), including 0.00014 Tg of Brown Carbon (BrC - the portion of OC that absorbs towards shorter wavelengths). Although these fires were small compared to fires burning at the same time in North America and Eurasia, a large fraction of the BC, OC, and BrC emissions (30%) was deposited on the Greenland ice sheet. Measurements of aerosol optical depth in western Greenland showed that the air was strongly influenced by the Canadian forest fires. Even so, the Greenland fires had an observable impact, doubling the column concentrations of BC. The spatiotemporal evolution and, in particular, the top height of the plume was also confirmed using the vertical cross section of total attenuated backscatter (at 532 nm) from Cloud-Aerosol Lidar and Infrared Pathfinder Satellite Observations (CALIOP) Lidar. The maximum albedo change due to BC and BrC deposition from the Greenland fires was -0.007 at maximum, while the average instantaneous BOA (Bottom Of the Atmosphere) radiative forcing over Greenland at noon on 31 August 2017 (post-fire) was between 0.03 and 0.04 Wm⁻², with locally occurring maxima up to 0.77 Wm⁻². The summer 2017 fires in Greenland had a small impact on the Greenland ice sheet, causing almost negligible extra radiative forcing. This was due to the comparably small size of the fires in Greenland, in a global and Pan-Arctic context. However, with 30% of the emissions deposited on the Greenland ice sheet, the 2017 Greenland wildfires were very efficient climate forcers on a per unit emission basis. Thus, while the fires in 2017 were small in size on a global scale, if the expected future warming of the Arctic (IPCC, 2013) produces more and larger fires in Greenland (Keegan et al., 2014), this could indeed cause substantial albedo changes and, in turn, contribute to accelerated melting of the Greenland ice sheet.



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5 Non-fire anthropogenic versus fire emissions

To place current Arctic fire emissions into context, GFASv1.2 emissions (Kaiser et al., 2012) were compared to non-fire anthropogenic emissions from the integrated assessment Greenhouse gas - Air pollution Interactions and Synergies, or GAINS model (Amann et al., 2011, Klimont et al., 2017), with a focus on BC and PM_{2.5}. The GAINS model was chosen because it considers explicitly environmental policies and assess their impact on current and future emissions (Amann et al., 2011; Klimont et al., 2017; Amann et al., 2020) and projects emissions from various anthropogenic sectors on five-year time steps. For this comparison, we use 2010, 2015, and 2020. Global GFAS data was downloaded from the European Centre for Medium-Range Weather Forecasts (ECMWF, https://apps.ecmwf.int/datasets/data/cams-gfas/). GFAS was chosen for this comparison because it produced in near real-time on the global scale, unlike GFED which is a historical product and at the time of this writing had not completed the 2020 emission estimates. GFAS also did not show consistently low emissions for the Pan-Arctic region, like FINN (Fig. 2). Further, GFAS is currently used as an operational product for global and regional forecasting (Inness et al., 2019), thus likely to be integrated into policy-making decisions on fire management. The GFAS "wildfire" emissions include all open biomass burning activity, with no differentiation between human-caused ignitions and natural sources, like lightning, but attempt to remove spurious fire emissions from industrial, volcanic, and geothermal sources (Rémy et al., 2017). Data was clipped to Pan-Arctic extents at 50°N, 60°N, and 65°N. GFAS wildfire emissions data has a spatial resolution of 0.1°, so it was aggregated to 0.5° for comparison with GAINS. Since the 2020 wildland fire season in the Arctic was unprecedented (Witze, 2020), with approximately 27% of fires in Siberia burning above 65°N (Conard and Ponomarey, 2020), we used the 2020 GFAS emissions to replicate potential future fire regimes by mid-century, i.e., 2050, with climate change-driven expansion of fire seasons and likelihood for extreme fire weather and risk (see Sect. 3).

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Fig. 4, 5, and 6 present 2010, 2015, and 2020 annual BC, PM_{2.5}, and CH₄ emissions, respectively, from four main source sectors of GAINS ECLIPSEv6b (Höglund-Isaksson et al., 2020) and biomass burning from GFAS at the global-scale (left) and above 50° N and 60° N. Globally, residential combustion, i.e., oil, coal, wood, etc. used for heating, is the main anthropogenic source of BC emissions for these years and is the largest overall when compared with GFAS wildfire emissions (Fig. 4, left). Bond et al. (2004) estimated BC emissions from open biomass burning from wildlands and agricultural fires to be higher than other sources, but we did not find that when comparing GAINS emissions with GFAS fire emissions at the global scale. However, in the northern latitudes, wildfires surpass the four anthropogenic sources: residential, transportation, gas flaring during oil and gas exploration and production, and the sum of all other sources, i.e. 'Others'. North of 60° N, gas flaring is the main anthropogenic source, with comparable but still smaller emissions than GFAS wildfire emissions estimates. As Fig. 4 shows, 2020 was an extreme year for Arctic wildfires (York et al., 2020), with BC emissions above 60° N twice as high as in 2010 and 2015. For PM_{2.5}, wildfires have higher emissions than the anthropogenic sectors globally, and the difference increases in the northern latitudes (Fig. 5). Globally, the agriculture sector is the main source of CH₄, with energy, flaring, and waste sectors all emitting more than wildfires (Fig. 6). Above 50° N, the same anthropogenic sectors are the main CH₄ sources,





though in 2020 wildfires emitted more methane than the energy sector. A similar phenomena occurred above 60° N, where depending on the year, wildfire emissions are comparable to the energy sector, while flaring has higher emissions than all the other sectors combined, including agriculture.

Arctic shipping is often brought up as a potentially important source of BC within the Arctic in the future. According to GAINS, in 2015 shipping comprised only 0.6 % of anthropogenic BC emissions north of 60° N. However, according to a white paper by the International Council on Clean Transportation (ICCT; Comer et al., 2020), BC emissions from Arctic shipping increased by 85% between 2015 and 2019. Their definition of Arctic is as described in the International Maritime Organization (IMO) Polar Code, i.e., they assessed shipping in much of the High Arctic above the Barents and Kara Seas but inclusive of waters between Alaska and Russia as far south as 60°N. In our comparison, shipping is included in the transport sector of GAINS emissions.

Fig. 7 shows the monthly BC emissions averaged from 2010, 2015, and 2020 for the globe and the three northern latitude breaks of 50°N, 60°N, and 65°N for the two leading sectors - wildfires and residential combustion. As with global annual emissions (Fig. 4), residential combustion is the main source sector in most months. However, in July and September the wildfire emissions are similar to residential combustion, and in August they are higher at the global-scale. These two sectors show opposite temporal profiles during the year (Suppl. Fig. 1). Residential combustion is highest in the winter months, but wildfires grow during the spring and reach their maximum in the summer, generally falling off in September with the exception of 2020 fire emissions. In the northern latitudes, strong spring emissions in April correspond with the global signal (upper panels of Fig. 7), while the summer months comprise an even larger share of the annual emissions than in the global average.

Consistently, wildfire emissions account for more than half of all black carbon emissions north of 60°N and 65°N (Fig. 8), representing up to 74% and 82% of 2020 BC emissions, respectively (Suppl. Table 3). At these northern latitudes, wildfires and flaring are the main sources of black carbon, especially north of 65°N with these two sectors accounting for 93% of black emissions, compared to 88% for 60°N. North of 50°N, residential, transport, and flaring are proportionally larger than north of 60°N and 65°N, but still less than wildfire emissions (Suppl. Fig. 2). North of 60°N, wildfire emissions have increased from 2010 to 2020, particularly above 65°N. Of those wildfire emissions from GFAS that were above 60°N, 21% in 2010 and 27% in 2015 occurred above 65°N (Suppl. Table 3). However, in 2020 the percentage was 56% (Fig. 8), indicating how extreme the 2020 wildfire year was in the Arctic.

Given the large portion of black carbon emissions from fires in comparison to anthropogenic sources as modeled by GAINS, understanding the local climate and air pollution impacts for the Arctic Council region is key. For example, the timing of fires in agricultural landscapes, boreal forest fires, and the Arctic tundra occur during the early spring to early summer months (i.e., March through May for 50° N and May and June for 60° N and 65° as seen in Suppl. Fig. 1) when BC transport and deposition



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to the Arctic is possible and critical for the cryosphere (Hall and Loboda, 2018) and air pollution (Law and Stohl, 2007), both from long-range (Thomas et al., 2017) and local sources of BC deposition (Evangeliou et al., 2019). For example, BC transport is possible as early as March into mid-May for agricultural landscapes of eastern Europe (Hall and Loboda, 2017) and peatlands, grasslands, and forests in North America (Qi and Wang, 2019), with fires grasslands, forests, and agricultural lands most common in southern Siberia (Kukavskaya et al., 2016) and the Russian Far East (Hayasaka et al., 2020) during the spring months of March, April, and May. The boreal forest fire season starts in April and May in Canada (Tymstra et al., 2020) and Siberia (Soja et al., 2004b; Conard and Ponomarev, 2020), moving north into Alaska by early June (Partain et al., 2015). Fires and associated transport of black carbon to the Arctic in the spring months of March to June tend to be climatically important when deposition on the cryosphere can accelerate surface melting (Bond et al., 2013). In spring and summer of 2020, fires in the Arctic landscape of northern Sakha Republic were burning as early as the beginning of May (McCarty et al., 2020), indicating a local source of black carbon. Likewise, wildfires in Greenland in July 2017 and July 2019 confirm that a local source of BC deposition on the Greenland Ice Sheet is possible (Evangeliou et al., 2019). Wildfire PM_{2.5} emissions are local sources of air pollution for urban and rural communities across the Arctic (Mölders and Kramm, 2018; Schmale et al., 2018), often peaking in summer months.

6 Fire management in the Arctic

Active fuels management, like prescribed fires and even allowing wildfires to burn under non-severe fire weather conditions, may be more effective than fire suppression and/or efforts to eliminate all fire from northern landscapes (McWethy et al., 2019), including in novel landscapes caused by warming in the Arctic. Fuel treatments in the boreal zones of Alaska were modeled to be effective for at least 14 years post-treatment, especially in shaded fuel breaks that reduce canopy cover and ladder fuels (Little et al., 2018). However, in dried and degraded peatlands of the Arctic region, fuels management will be more complicated outside the boreal forest and forest-tundra gradient, where mulching treatments that convert canopy and surface fuels to a masticated fuel bed can limit peat burn depth in Black Spruce (Picea mariana) stands (Wilkinson et al., 2018). Privately-owned grassy tussock tundra and dwarf shrub tundra vegetation types are more likely to burn than low shrub tundra in Alaska (Hu et al., 2015), showing relatively rapid vegetation re-greening within a decade after burning for shrub and tussock tundra (Rocha et al., 2012). While prescribed burning could be effective in fuel management for tussock and dwarf shrub landscapes of the tundra, prescribed burning effectiveness for peatlands is less clear. Peat fire risk and burn depth, however, is less influenced by canopy and ground vegetation and more by soil bulk density (impacting air availability in soils), the water table depth, and precipitation (Kieft et al., 2016). After the devastating 2010 fires in the Moscow region, the regional government undertook an ambitious 70,000 ha peatland rewetting project to reduce fire risk (Sirin et al., 2014), a landscapescale process that can be monitored using existing Earth observation sensors at the moderate resolution (30 m Landsat to 10 m Sentinel-2; Sirin et al., 2018). To date, the effectiveness of this campaign is unclear, but in practical terms it should reduce fire risk. In the larger context of CH₄, Günther et al. (2020) used a radiative forcing model to determine that methane emissions





from peatland rewetting are less significant in the short-term when compared to the CO₂ emissions from degraded or drained peatlands increasing long-term warming when rewetting is postponed. Adaptive management strategies of the timber industry in Fennoscandia could also reduce fire risk. Intensive management via ditch network maintenance and fertilization of drained peatlands will increase timber values while also rewetting the peat (Ahtikoski and Hökkä, 2019). Prescribed burning for silvicultural retention and maintaining and regenerating pure stands can also reduce fuel loadings while increasing biodiversity (Lindberg et al., 2020).

Human ignition sources and determining how demographic, migration, and/or development patterns in these changing landscapes will impact fire activity and related emissions (Robinne et al. 2016; Reilly et al. 2019). For example, consider agricultural landscapes as one source of fire. Expanding climate-driven agricultural frontiers in the high northern latitudes under RCP8.5 scenario for 2060-2080 could add 8.5 million km² of new croplands in Canada and Russia alone, expanding wheat and maize production into areas with carbon-rich or peat soils (Hannah et al., 2020). Further, Parfenova et al. (2019) found crop growing conditions would be established in some of the permafrost zones of Siberia under RCPs 2.6 and 8.5 by 2080, favorable for wheat and maize (silage) production. These crops are commonly managed via open burning practices in the U.S., eastern Europe, Russia, and Canada (Kutcher and Malhi, 2010; McCarty et al., 2017; Theesfeld and Jelinek, 2017; Shiwakoti et al., 2019; Thompson and Morrison, 2020). Thus, seasonality of burns and management of croplands, grasslands, and deciduous forests may occur at times when transport of emissions to the Arctic is likely, i.e., late winter/early spring for Russia (Hall and Loboda, 2018; Qi and Wang, 2019) and Canada and north central U.S. (Viatte et al., 2015), respectively.

While open biomass burning emissions are episodic in nature when considering emissions from single extreme wildland fire events and even wildfire seasons, the spring to early summer human-caused fires are a consistent source of BC and PM_{2.5} that can be managed and potentially reduced. From the policy perspective, and how these events will contribute to Pan-Arctic pollution, is important to consider for future Arctic Council collaboration and coordination among Member States, Arctic Indigenous Permanent Participants, and non-Arctic Observer States. For future Arctic fires, policy controls are effectively limited to fuels management, reduction of human ignitions, and wildland firefighting in the Arctic and the boreal zone (Flannigan et al., 2013). Further, wildland firefighting techniques in the boreal forest will not be appropriate for the more fragile permafrost- and peat-dominated Arctic tundra and will need to be specifically tailored, for example, to the tundra (French et al., 2015). Collaboration, cooperation, and innovation are needed for future Arctic wildland firefighting techniques, practices, and implementation, particularly in the context of emissions reductions.

7 Knowledge gaps and associated uncertainties

Here we highlight the key problems summarized from the review of scientific literature in an attempt to focus future research efforts. It is important to reduce the uncertainties below to understand Arctic fire regimes and emissions, especially given that



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climate change potentially introduces a new fast-moving uncertainty. Improving the understanding of the current and future Arctic and boreal fire regimes will be important for Arctic policymakers as well, given a rapidly changing Arctic and the influence of these fire regimes on climate systems, fragile Arctic ecosystems, and society (Rogers et al., 2020). Overall, a major uncertainty exists in conceptualising and documenting what constitutes a shift in fire regimes of a certain region or even Pan-Arctic (i.e., current fire climatology versus fuel types) and what happens when a new regime is about to emerge (i.e., future projections of climatic and ecological conditions). Specific recommendations are made in each subsection to propose next steps.

7.1 Future fire landscapes and regimes

Future Arctic fire regimes will be impacted by changing vegetation on the landscape (Tchebakova et al., 2009; Sizov et al., 2021), with both climate change and subsequent fire seasons, i.e., fire disturbance, impacting the species and locations of future vegetation on Arctic and boreal landscapes (Foster et al., 2019). For example, fire and the thawing of permafrost are considered to be the principal mechanisms that will shape new vegetation physiognomies for Siberia (Polikarpov et al., 1998; Tchebakova et al., 2010). Important to note that moisture from summertime thaw of the active layer of permafrost provides necessary moisture for forest growth in the dry environment of interior Siberia, otherwise only steppe could exist without this additional moisture (Shumilova, 1962). In the dry climate in interior Siberia, frequent fires eliminate any of the dark conifer undergrowth that may have become established in suitable sites within the permafrost zone. The fire return interval in the light conifer (larch, Larix spp., and Scots pine, Pinus sylvestris) middle taiga in central Siberia is 20–30 years (Furyaev et al., 2001), compared to 200-300 years in dark conifer (Siberian pine, Pinus sibirica, and fir, Abies sibirica) forests in southern Siberia, including mountain taiga. Slowly growing dark conifers are not adapted to frequent fires and typically die; additionally, they are not light-tolerant, so they are not likely to be the first species to succeed following fire events. On the other hand, Larix dahurica is evolutionarily adapted to fire and successfully regenerates when cones open following fire events. For East Siberia, Polikarpov et al. (1998) speculated that post-fire succession would mean that dark conifers would be replaced by Scots pine in southern dry climates and by larch on cold soils in a warmer climate. Zonal dark conifers would shift northwards and eastwards following permafrost retreat, and light-needled tree species (e.g., Pinus sylvestris and Larix sibirica) would follow them, expanding from the south. In the transition zone between dark-needled and light-needled tree species, birch and mixed light conifer-hardwoods subtaiga and forest-steppe would dominate, likely reducing fire risk. In the southern tundra of Yamalo-Nenets Autonomous Okrug in northwest Siberia, a transition from dry dwarf shrub to woodlands (< 50% of area is covered by trees) has been documented in previously burned areas (Sizov et al., 2021).

Siberian forests are predicted to decrease and shift northwards and forest-steppe and steppe ecosystems are predicted to dominate 50% of Siberia by 2080 under RCP 8.5 (Parfenova et al., 2019), meaning agriculture in Siberia would likely benefit from climate warming. About 50-85% of central Siberia was predicted to be climatically suitable for agriculture (Tchebakova et al., 2011), although potential croplands would be limited by availability of suitable soils. Crop production may increase by





twofold. The introduction of new agricultural crops could likely be less costly than afforestation with new tree species climatypes. Farming may be a preferred land use choice in the future where forests would fail due to climate change, with regional business and economy authorities determining what specific measures may be undertaken to support forestry, agriculture, or mixed agriculture and forestry practices in order to optimize economic loss or gain effects of climate change. Therefore, understanding how climate change and ongoing fire disturbance in the boreal and Arctic will impact species distribution, and thus fuel availability, remains complex (Shuman et al., 2017) and more work in coupled fire-climate-ecological models, with considerations for permafrost and human-driven land use and ignition in emerging agricultural systems, for the Arctic and boreal is needed.

7.2 Peatlands

Peat smouldering can emit large quantities of smoke, contributing to hazardous air quality (Hu et al., 2018). Current global fire emissions inventories underestimate peat fires, as forest fuel types currently drive fuels maps and profiles (Liu et al., 2020). Boreal zone peatland fires are not well quantified in terms of fuel loadings (Van Leuwen et al., 2014). High uncertainty in emission factors for boreal peat fires (Hu et al., 2018) has led to improved laboratory-derived emission factors from sampled peat from Russia and Alaska (Watson et al., 2019). Burn depth is also not well captured outside of localized spatial scales, like sampling plots, given lack of Earth observation sensing capabilities and pre-fire and post-fire soil surveys (Rogers et al., 2014), which can lead to emissions underestimations.

With a warming climate, there is a risk of increasing peatland and "legacy carbon" fires (Ingram et al., 2019) in boreal forests, particularly in stands younger than 60 years where drying limits the resilience of the carbon rich soils (Walker et al., 2019) and in drying fen watersheds near large settlements, like the costliest wildfire in Canada's history - the May 2016 Horse River/Fort McMurray fire (Elmes et al., 2018). Future emission estimates from peat fires will need to be informed by where and in what condition these carbon-rich soils reside, particularly as predicted moderate and severe drought in boreal peatlands western Canada are expected to increase fire size by over 500% (Thompson et al., 2019). Mapping pan-Arctic peatlands has proved challenging (Yu et al., 2010; Xu et al., 2018), with recent improvements linking permafrost to peat storage (Hugelius et al., 2020). Further, difficulties in estimating and/or accounting for water table depth and moisture content of peat when modeling depth of burn and associated emissions during smouldering is a key observational uncertainty (Kiely et al, 2019). Future fuels data will need to account for how the complexities of the boreal and Arctic peat topography will impact rate of post-fire peat soil accumulation (Ingram et al., 2019), with some landscapes remaining resilient with other marginal peat areas with severe smouldering and fewer sediment inputs becoming sources of legacy carbon emissions, thus driving future fuels availability. Current Earth system models underestimate evaporative water loss and overestimate current and future water availability for boreal peatland systems under RCP 4.5 and 8.5 warming scenarios, perhaps underestimating fire risk, activity, and emissions in peat systems (Helbig et al., 2020).



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Climate mitigation efforts, like restoration or rewetting of peatlands, do not eliminate the role of fire as a management tool (Davies et al., 2016) nor the risk of wildland fire in peat landscapes. Thus, estimates of future fire emissions will need to assimilate complexities associated with peat fuel conditions and loadings. For example, restoration of peat is not a linear process, with previous results in Canada showing one to two decades needed for restoration and rewetting of degraded peatlands that have residual peat and vegetation to 'seed' the sites (Nugent et al., 2019). Until these restored peatlands have sufficient moisture and vegetation cover, they are still susceptible to fire risk. Burn depth in peat can be limited in naturally wet and rewetted peatlands if the surface maintains a high moisture content via hydrological and vegetation processes (Granath et al., 2016). Maintaining these needed hydrological processes is difficult for degraded, unmanaged peatlands. In Alberta, wildland peat sites lacking constant sources of water and depositional inputs experienced severe burning on margins (Ingram et al., 2019), while Wilkinson et al. (2019) found forested peatland margins were extremely vulnerable to peat smouldering combustion, especially in previously burned areas with > 60 years since fire. Ronkainen et al. (2013) expect a warmer climate to lower water tables via evapotranspiration for unmanaged peatlands in Finland, thus increasing wildfire risk. Producing more complete estimates of fuel loadings for peatlands across the Arctic region can follow methodologies set by Johnston et al. (2015) to augment the dynamic boreal, taiga, and tundra fuel loadings, e.g. Innes (2013) and Ivanova et al. (2019).

7.3 Permafrost

Approximately half of all peatlands in the Northern Hemisphere are coincidental with permafrost (Hugelius et al., 2020), with many discontinuous permafrost sites dominated by peatlands in Canada (Estop-Aragonés et al., 2018; Gibson et al., 2018), Russia (Hugelius et al., 2014), and Sweden (Chang et al., 2019). In the flat West Siberian terrain, Kotlyakov and Khromova (2002) and Malevsky-Malevich et al. (2001) show no continuous or discontinuous permafrost below 65°N, which influences the viable vegetation for the tundra and sparse Larix sibirica taiga. Current climate models may be missing the link between melting ground ice, sometimes referred to as thermokarst processes, and potential permafrost degradation of the currently stable and carbon-rich northeast Siberian Arctic lowlands (NESAL). Nitzbon et al. (2020) indicate that we can expect a threefold increase of permafrost thaw in the NESAL region under RCP4.5 (a stabilization scenario) by 2100 when thermokarst processes are combined with increased temperature projections in numerical modelling, potentially increasing the amount of peat fuels in an already high fire activity region. Combining current peatland distribution maps with newer modeled datasets of predicted mid-century and late-century permafrost extent and geohazard indices under climate-forcing scenarios (Karjalainen et al., 2019) can reduce uncertainties to determine: 1) increased peat fire risk and locations due to permafrost thaw and 2) decreased capability to deploy ground-level wildland firefighting, thus limiting ability to control future peat fires and fire emissions in the Pan-Arctic. Further, permafrost thawing changes hydrology (e.g. greater river discharge or disappearing lakes) and geomorphology (solifluction and thermokarst processes) across broad expanses of the contemporary permafrost zone. In a warmer and drier climate, many locations in the Arctic may be affected by solifluction, with thermokarst modified by frequent catastrophic fires, and deeper active layer thaw. As a whole, retreating permafrost should cause a





reduction in the area of forests and their replacement by steppe on well-drained, tilted geomorphology (Lawrence and Slater, 2005) or by bogs on poorly-drained plains (Tchebakova et al., 2009).

Permafrost areas, especially at their southern distributions, are being disturbed by wildfires (Holloway et al., 2020). In Alaska and northwestern Canada, the impacts of wildfire disturbances on permafrost have been well quantified. For instance, post-fire permafrost change in Alaska showed surface warming greater in boreal sites than tundra, with surface temperatures higher for previously burned sites than at unburned sites, even after vegetation recovered for one to four decades (Jiang et al., 2017). In the North Slope of Alaska, recent evidence suggests that a transition from grasses to shrubbier conditions is occurring post-tundra fires (Jones et al., 2013). Though the vast majority of fires in the continuous and discontinuous permafrost zones occur in deciduous needleleaf forests (Loranty et al., 2016), knowledge gaps on post-fire permafrost resiliency exist for larch-dominated forests (*Larix spp.*) in Siberia. For instance, recent work in Sakha Republic found that a 36 km² wildfire in an open larch with shrub and moss lichen landscape northwest of the Batagaika megaslump resulted in approximately 3.5 million cubic meters of permafrost five years later (Yanagiya & Furuya, 2020). Likewise, uncertainties persist for post-fire permafrost resiliency in the boreal forests of eastern Canadian, like Quebec and Labrador (Holloway et al., 2020). As with peatlands, improved geospatial products advance our understanding of the potential for impacts of wildfires across large spatial scales (Hugelius et al., 2020).

7.4 Satellite-based fire emissions

Fire regimes for the boreal are often described by impacts to and from fire emissions (Rogers et al., 2020), with many modeling emissions in the high northern latitudes using Earth observations. Uncertainties in emission models are driven by availability and quality of fire activity data from satellite- and ground-based sources, as well as incomplete knowledge of fuels and emission factors. Current global fire emission inventories rely on satellite-derived fire activity from active fire detections, burned area mapping, and fire radiative power (Liu et al., 2020). A comparison of four satellite-based global fire emissions databases over North America - GFED, FINN, GFAS, QFED - found that assumed portions of dry matter in fuels and not emission factors were creating biomass burning aerosol estimates that differ by factors of four to seven, essentially limiting the ability to accurately quantify the impact of smoke on climate and air quality (Carter et al., 2020). Given the international scientific community's reliance on two main fire emissions factor sources (Akagi et al., 2011; Andraea, 2019 as an update to Andraea & Merlet, 2001), information available for a robust uncertainty analysis for this variable is limited (Pan et al., 2020).

Satellite-based observations of fire in the Arctic and boreal regions underestimate open burning in agricultural landscapes, surface fires in boreal forests, and smouldering peat fires. For example, current emission inventories based on satellite-derived products of burned area, like GFEDv4, underestimate human-caused burning in agricultural landscapes and mixed forests in Eurasia between 50° to 65° N by approximately 2,100 km² annually (Zhu et al., 2017), indicating that actual burned area from





anthropogenic ignitions in the Eurasian boreal zone is currently underestimated by as much as 16%. Surface fires under forest canopies dominate fire regimes in much of Northern Eurasia, but these fires are not well quantified in current satellite-based burned area products (Rogers et al., 2015; Duncan et al., 2020) and thus emission inventories. Smouldering fires in carbon-rich humus and peat landscapes will be difficult to detect, as smouldering combustion occurs at much lower temperatures than flaming combustion; 500°C to 700°C versus 1500°C to 1800°C, respectively (Rein et al. 2008). As previously mentioned, daily, global observations of low-intensity fire from existing satellite systems are limited currently to VIIRS (Johnston et al., 2018), as it was designed to detect smaller and cooler fires than MODIS. For this review, the versions of GFAS, GFED, FINN, FEER, and QFED analysed rely on MODIS thermal anomalies, unlike the custom AMAP fire emissions which used VIIRS only. Smouldering fires in the Arctic can be mapped via regionally-tuned algorithms designed to ingest daily active fire detections from multispectral VIIRS (Waigl et al., 2017) and hyperspectral Hyperion (Waigl et al., 2019) sensors. In general, satellite and drone detections (Burke et al., 2019) of smouldering peat fires are difficult because ground fires are low temperature and can burn underground and re-emerge in new locations (Rein, 2016), with additional existing detection constraints from coarse resolution (> 1 km) global satellite sensors, canopy cover, and cloud cover (Johnston et al., 2018).

A further complication is that peat fires can smoulder for months, years, and even decades (Hu et al., 2018), burning laterally and vertically below surface, appearing to be extinguished, but releasing smoke at the surface in a different location from the original ignition site. This phenomenon is referred to as holdover, overwintered, and/or zombie fires, and makes it difficult to allocate as a single - but complex - fire event from cumulative satellite active fire and burned area pixels. For example, in April 2020, the Alaska Division of Forestry was monitoring several active smoldering peat fires from the ~ 5 km² Deshka Landing Fire of August 2019 that had overwintered near Willow, Alaska despite heavy snow melt (Alaska Wildland Fire Information, 2020). Preliminary results by Scholten and Veraverbeke (2020), indicate that overwintering fires are more likely to be holdovers from high severity fires, emerging more frequently in lowland black spruce-dominated boreal forests. McCarty et al. (2020) hypothesize that some of the earliest fires along still-frozen thermokarst lakes of Sahka Republic in May 2020 may be holdover fires, as the drivers and extent of early season human-caused ignitions are still not well-documented in the scientific literature for much of the Arctic.

7.5 Lack of agreement between official statistics and satellite observations

Earth observations from satellite products are powerful tools for forecasting (Pickell et al., 2017), improving rapid response post-fire modelling (Miller et al., 2017), and quantifying fire in the boreal and Arctic regions (Hislop et al., 2020). Consistently, however, there has been little correlation between satellite-derived and official estimates of burned area (Fusco et al., 2019). Loepfe et al. (2012) found that multiple satellite fire products had high correlation with official reports of burned areas for Sweden, but little to no correlation with official statistics for Finland. Agreement of official Russian burned area statistics from fires in Siberian forests was less than 10% when compared to four satellite-based burned area products (Kukavskaya et al.,



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2013). Average official satellite-derived Russian burned area estimates differ by a mean of 48% for 2002 to 2015 in comparison to the Loboda et al. (2017) regionally-tuned product, which only differs by a mean of 18% in comparison official burned area statistics for Alaska and Canada. North American and Nordic countries have long-term ground-based boreal burned area records that span 50 years or greater, which aids in calibrating current satellite data records and analysing relationships between fire regimes, vegetation, weather, and climate. Long-term accurate fire records do not exist for much of Russia, primarily because fire was not historically recorded in the remote 'unprotected territories' (Sofronov et al., 1998; Soja et al., 2004). Consequently, understanding of the balance between surface-to-crown fire and the ecosystem-dependent areas that burn in Siberia is limited, which adversely affects fire emissions estimates. The Global Wildfire Information System (GWIS; https://gwis.jrc.ec.europa.eu/), joint program between the Group on Earth Observations (GEO; https://www.earthobservations.org/geoss wp.php), Copernicus (https://www.copernicus.eu/en/services/emergency), and NASA (https://www.nasa.gov/), uses the MODIS MOD64A1 Collection 6 Burned Area product (Giglio et al., 2018) to create country-level burned area statistics. GWIS satellite-derived burned area overestimates open biomass burning in both Norway and Finland by 199% and 129%, respectively, when compared to official statistics (Table 3). GWIS underestimates open biomass burning in Sweden by 48%. Future open biomass burning emissions will need improved satellite fire detection methodologies for the Arctic and boreal regions and also shorter latency in ground reports and statistics from official agencies. Further, verifying satellite detections of fires via ground-level verification will require a concerted effort and likely lead to a better understanding of how and why these two fire data sources do not presently align.

8 People and future Arctic fire regimes

Prevention and management of Pan-Arctic fires are limited to reduction of human-caused ignitions and management of landscape fuels (Flannigan et al., 2013). The impact of humans on fire risk is dependent on local- to national-scale actions that may increase fire and emissions via deforestation, transportation networks, energy extraction, and agricultural open burning as well as decrease fire and fire emissions via active suppression. On a practical level, people are the main ignition sources for fires in the Arctic region, while lightning ignitions tend to lead to larger fires. In interior Alaska, where lightning-caused fires account for 95% of total burned area (Veraverbeke et al., 2017), 52% of total ignitions were human in origin but occured in areas of high fire suppression resulting in only 5% of total burned area from 1990 to 2016 (Calef et al., 2017). Archard et al. (2008) estimated 65% of all forest fires in the Russian Federation were caused by human ignition, and a more recent study found approximately half of all fires in Sakha Republic are caused by anthropogenic activities (Kirillina et al., 2020). Throughout boreal Canada, anthropogenic factors increase fire probability (Parisien et al., 2016), with humans igniting most fires close to roads while lightning-caused fires are responsible for the majority of burned area in the more remote locations (Gralewicz et al., 2012). Blouin et al. (2016) found that 45% of wildfires in Alberta were started by lightning, but responsible for 71% of burned area. In Finland, lightning-caused fires account for less than 15% of forest fires (Larjavaara et al., 2005). Machines used for forestry operations in stony areas of Sweden account for 7-10% of total annual ignitions and 40% of total





burned area (Sjöström et al., 2019). For the 19 European countries reporting fires and ignition sources to the European Forest Fire Information System (EFFIS; https://effis.jrc.ec.europa.eu/), de Rigo et al. (2017) determined only 4% of fires were from natural sources, with half of the fire records lacking a verified cause.

Indigenous Fire Management (IFM) and understanding Indigenous use of fire, as well as fire risk and response to fire events (Mottershead et al., 2020), are needed in a changing Arctic environment. IFM is more frequently being deployed in fire-prone and/or fire-adapted areas (Nikolakis et al., 2020), which accounts for much of the boreal but not necessarily Arctic ecosystems. Cogos et al. (2019) documented historical place names in northern Sweden (e.g., *roavve* and *roavvi*) related to historical Saami practices of burning pine heath landscapes to improve long term foraging of reindeer. Approximately one out of every ten people in the Arctic are Indigenous (Nordregio, 2019), compromising an estimated 15% of the population of Alaska, 53% of the northern territories of Canada, and 98% of Greenland, for a total of 1.13 million Indigenous peoples in the Pan-Arctic (Young and Bjerregaard, 2019). Arctic communities are demanding more leadership roles in climate research and applications (Stone, 2020). Research- and experiential-driven recommendations on how to incorporate traditional, Indigenous knowledge into Arctic Council working groups efforts, including (1) Use of participatory methodology; (2) Use of Indigenous methodologies; (3) Recognition that traditional ecological knowledge is local; (4) Application to policy; and (5) Cross-cultural understanding (Sidorova, 2020), align well with community- and landscape-driven fire science methodologies needed to predict future fire risk (Bowman et al., 2020; Johnston et al., 2020) and to answer many of the fire regime and emission, including ignition and fuel type, uncertainties raised in this review. Who better to ask - and to lead - than the people who live there?

9 Conclusions

Since the mid-2000s, emissions from open biomass burning have increased above 60°N, with fires above 66°N occurring earlier in the year and burning later into the growing season, indicative of changing Arctic fire regime. Compared to anthropogenic sources in the GAINS model, biomass burning already accounts for more BC and PM_{2.5} emissions than anthropogenic sources north of 60°N, including flaring from associated gas from oil and natural gas extraction. Increased length in fire seasons is coupled with prediction of increased fire severity, with predictions of essentially physically unmanageable crown fires in the boreal as soon as 2050 (Wooton et al., 2017). Future emissions from fires are difficult to predict and here more work is needed. For example, emissions from functionally uncontrollable fires in boreal forests are not well quantified due to uncertainties in combustion efficiency observations and estimates (Xu et al., 2020).

In contributing to the AMAP 2021 assessment of SLCFs, this review was driven by policy questions identified by member states of the Arctic Council (Table 1), and builds on the 2011 (AMAP, 2011) and 2015 (AMAP, 2015) reports, which included some analysis and discussion of natural, 'semi-natural' (i.e., human-caused ignitions in wildland landscapes), and agricultural





field burning. We did not perform a systematic review of the fire research literature (Robinne et al., 2020), and the existing literature cited was not assessed for limitations or errors. Further, while the authors attempted to cite published literature and official fire statistics for the seven Arctic Council states experiencing open biomass burning (excluding Iceland), we know that bias may still be present in the over 200 peer-reviewed sources of literature and data chosen for this review (Johnston et al., 2020). This review is a starting point, a foundation for future Pan-Arctic research agendas for fire monitoring and needed systematic reviews (Haddaway et al., 2020) of future fire risk, fire emissions, and fire prevention and management in the Arctic - all needed to accurately describe future Arctic fire regimes.

Future Arctic fire regimes will likely be driven by climate change impacts on fuels, including the interactions between peat and permafrost, fire weather, and ignition sources as well as the complexities of climate and fire disturbance changing vegetation types (Tchebakova et al., 2009; Shuman et al., 2017). The consensus of current literature is that climate change and human activity will increase fire risk in the Arctic, via increased lightning strikes, thawing of permafrost, transitions to grasses, taiga, and dry peat, and more human-caused ignitions. In eastern Canada, the northward expansion of deciduous forests will likely decrease fire risk, which may also be true for portions of southern Siberia and Fennoscandia. Human- and lightning-caused fires are likely to increase given expansion of energy extraction, transportation networks, tourism, and climate change. Further, Arctic landscapes are complex, with high levels of localized heterogeneity due to polygonal tundra landforms (Lara et al., 2020), complex and endemic vegetation types and communities (Raynolds et al., 2019), and topography (Morin et al., 2016). Future fire emissions studies will need to integrate multiple datasets to accurately quantify Arctic fire regimes (Masrur et al., 2018), including climate, permafrost conditions, aboveground, surface, and peat fuels, topography, land use, Indigenous and local fire management, seasonality of burns, and ignition sources.

Human activity and communities in the Arctic will need to adapt to increasing fire risk. To prepare for these 21st century changes to the Arctic fire regime, evidence-based fire monitoring and management - including prevention strategies - must incorporate Indigenous and local knowledge in the Arctic. This will require increasing transdisciplinary research (Sidorova, 2020) to understand and predict fire in the North, how humans are and must adapt to a new fire prone landscape in the Anthropocene (Bowman et al., 2020), and Pan-Arctic collaboration and cooperation. Understanding ecological landscape changes, predicted to substantially increase across Asian Russia, is crucial information for developing viable strategies for long-term economic and social development in preparation for climate migration and strategic adaptation planning (Parfenova et al., 2019).

The Arctic Council's role as an agent of change in the region is promising, as it has moved its role from policy informing to policy making (Barry et al., 2020). Given the extreme fire season of 2020, an Arctic Council-led initiative for Pan-Arctic fire monitoring, prevention, and management is strongly needed for a rapidly changing Arctic (McCarty et al., 2020). Such efforts have started, including the Arctic Wildland Fire Ecology Mapping and Monitoring Project (Arctic FIRE;





- 787 https://www.caff.is/arcticfire) led by the Gwich'in Council International, an Indigenous Permanent Participant, via the
- Conservation of Arctic Flora and Fauna (CAFF) working group of the Arctic Council, as well as other Arctic Council activities.
- 789 Potentially expanding existing efforts or coordinating with new initiatives to incorporate the five other Indigenous permanent
- 790 participants, as well as more efforts from the science and disaster response agencies of the eight member states and the expertise
- of other Arctic Council working groups, could create the type of community- and Arctic-centric science needed for Pan-Arctic
- fire policies and to increase the capacity for the Indigenous peoples of the Arctic to monitor and protect their Arctic homelands
- 793 (Wilson, 2020) from fire risk and to adapt to the changing Arctic fire regime.

References

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- Abatzoglou, J. T., and Williams, A. P.: Impact of anthropogenic climate change on wildfire across western US forests, Proc.
- 797 Natl. Acad. Sci., 113, 11770-11775. https://doi.org/10.1073/pnas.1607171113, 2016.
- Ahtikoski, A., and Hökkä, H: Intensive forest management—does it pay off financially on drained peatlands?, Can. J. For.
- 799 Res., 49, 1101-1113, https://doi.org/10.1139/cjfr-2019-0007, 2019.
- Akagi, S. K., Yokelson, R.J., Wiedinmyer, C., Alvarado, M.J., Reid, J.S., Karl, T., Crounse, J.D. and Wennberg, P.O.:
- 801 Emission factors for open and domestic biomass burning for use in atmospheric models, Atmos. Chem. Phys., 11, 4039,
- 802 https://doi.org/10.5194/acp-11-4039-2011, 2011.
- 803 Alaska Division of Forestry: 2019 EOY handout, available at:
- http://forestry.alaska.gov/Assets/pdfs/firestats/2019%20Alaska%20Fire%20Statistics.pdf, 2020.
- 805 Alaska Wildland Fire Information: Despite heavy snow melt, Deshka Landing hot spots still smoldering, available at:
- https://akfireinfo.com/2020/04/24/despite-heavy-snow-melt-deshka-landing-hot-spots-still-smoldering/, 2020.
- 807 Alexander, H. D., and Mack, M. C.: Gap regeneration within mature deciduous forests of Interior Alaska: Implications for
- future forest change, For. Ecol. Manage., 396, 35-43, https://doi.org/10.1016/j.foreco.2017.04.005, 2017.
- Amann, M., Bertok, I., Borken-Kleefeld, J., Cofala, J., Heyes, C., Höglund-Isaksson, L., Klimont, Z., Nguyen, B., Posch, M.,
- 810 Rafaj, P., and Sandler, R.: Cost-effective control of air quality and greenhouse gases in Europe: Modeling and policy
- applications, Environ. Model Softw., 26, 1489-1501, https://doi.org/10.1016/j.envsoft.2011.07.012, 2011.





- Amann, M., Kiesewetter, G., Schöpp, W., Klimont, Z., Winiwarter, W., Cofala, J., Rafaj, P., Höglund-Isaksson, L., Gomez-
- 813 Sabriana, A., Heyes, C. and Purohit, P.: Reducing global air pollution: the scope for further policy interventions, Philos T R
- 814 Soc A., 378, 20190331, https://doi.org/10.1098/rsta.2019.0331, 2020.
- 815 AMAP: AMAP Assessment Report: Arctic Pollution Issues, Arctic Monitoring and Assessment Programme (AMAP), Oslo,
- Norway, xii+859 pp, available at: https://www.amap.no/documents/doc/amap-assessment-report-arctic-pollution-issues/68,
- 817 1998.
- AMAP Assessment 2011: The Impact of Black Carbon on Arctic Climate. Arctic Monitoring and Assessment Programme
- (AMAP), Oslo, Norway, Technical Report no. 4, available at: https://www.amap.no/documents/download/977/inline, 2011.
- AMAP Assessment 2015: Black carbon and ozone as Arctic climate forcers. Arctic Monitoring and Assessment Programme
- 821 (AMAP), Oslo, Norway, available at: http://hdl.handle.net/11374/1607, 2015.
- 822 AMAP Assessment 2021: Impacts of short-lived climate forcers on Arctic climate, air quality, and human health, Arctic
- Monitoring and Assessment Programme (AMAP), Tromsø, Norway (in prep).
- Andreae, M. O., and Merlet, P.: Emission of trace gases and aerosols from biomass burning, Global Biogeochem. Cycles, 15,
- 955-966, https://doi.org/10.1029/2000GB001382, 2001.
- Andreae, M. O.: Emission of trace gases and aerosols from biomass burning an updated assessment, Atmos. Chem. Phys.,
- 827 19, 8523–8546, https://doi.org/10.5194/acp-19-8523-2019, 2019.
- 828 Baranchikov, Y.N. and Montgomery, M.E.: Chapter XXXVI Siberian Moth, in The use of classical biological control to
- preserve forests in North America, edited by Van Driesche, R. and Reardon, R.C., United States Department of Agriculture,
- Forest Service, Forest Health Technology Enterprise Team, Morgantown, WV, USA,383-391, 2014.
- Barry, T., Daviðsdóttir, B., Einarsson, N., and Young, O. R.: The Arctic Council: an agent of change?, Glob Environ Change,
- 832 63, 102099, https://doi.org/10.1016/j.gloenvcha.2020.102099, 2020.
- Betänkande av 2018 års skogsbrandsutredning: Skogsbränderna sommaren 2018 [Forest fires in summer 2018, in Swedish].
- Statens offentliga utredningar (SOU) 2019:7, Stockholm. 1-334, 2019.
- 835 Bieniek, P.A., Bhatt, U.S., York, A., Walsh, J.E., Lader, R., Strader, H., Ziel, R., Jandt, R.R., and Thoman, R.L.: Lightning
- variability in dynamically downscaled simulations of Alaska's present and future summer climate, J Appl Meteorol Climatol,
- 59, 1139-1152, https://doi.org/10.1175/JAMC-D-19-0209.1, 2020.





- Blyakharchuk, T. A., Tchebakova, N.M., Parfenova, E.I., and Soja, A.J.: Potential influence of the late Holocene climate on
- settled farming versus nomadic cattle herding in the Minusinsk Hollow, south-central Siberia, Environ. Res. Lett., 9, 065004,
- https://doi.org/10.1088/1748-9326/9/6/065004, 2014.
- Boike, J., Grau, T., Heim, B., Günther, F., Langer, M., Muster, S., Gouttevin, I. and Lange, S.: Satellite-derived changes in the
- permafrost landscape of central Yakutia, 2000-2011: Wetting, drying, and fires, Glob Planet Change, 139, 116,
- 843 https://doi.org/10.1016/j.gloplacha.2016.01.001, 2016.
- Blouin, K. D., Flannigan, M. D., Wang, X., and Kochtubajda, B.: Ensemble lightning prediction models for the province of
- Alberta, Canada, Int J Wildland Fire, 25, 421-432, https://doi.org/10.1071/WF15111, 2016.
- Bond, T.C., Streets, D.G., Yarber, K.F., Nelson, S.M., Woo, J.H. and Klimont, Z.: A technology-based global inventory of
- 847 black and organic carbon emissions from combustion, J. Geophys. Res. Atmos, 109, 203,
- 848 https://doi.org/10.1029/2003JD003697, 2004.
- Bond, T.C., Doherty, S.J., Fahey, D.W., Forster, P.M., Berntsen, T., DeAngelo, B.J., Flanner, M.G., Ghan, S., Kärcher, B.,
- Koch, D., and Kinne, S.: Bounding the role of black carbon in the climate system: A scientific assessment, J. Geophys. Res.
- 851 Atmos., 118, 5380-5552, https://doi.org/10.1002/jgrd.50171, 2013.
- Boulanger, Y., Gauthier, S., Gray, D. R., Le Goff, H., Lefort, P., and Morissette, J.: Fire regime zonation under current and
- future climate over eastern Canada, Ecol Appl., 23, 904-923, https://doi.org/10.1890/12-0698.1, 2013.
- 854 Boulanger, Y., Gauthier, S., & Burton, P. J.: A refinement of models projecting future Canadian fire regimes using
- homogeneous fire regime zones, Can. J. For. Res., 44, 365-376, https://doi.org/10.1139/cjfr-2013-0372, 2014.
- Bowman, D. M., Kolden, C. A., Abatzoglou, J. T., Johnston, F. H., van der Werf, G. R., and Flannigan, M.: Vegetation fires
- in the Anthropocene, Nat. Rev. Earth Environ., 1, 500-515, https://doi.org/10.1038/s43017-020-0085-3, 2020.
- Burke, C., Wich, S., Kusin, K., McAree, O., Harrison, M.E., Ripoll, B., Ermiasi, Y., Mulero-Pázmány, M., and Longmore, S.:
- 859 Thermal-Drones as a Safe and Reliable Method for Detecting Subterranean Peat Fires, Drones, 3, 23,
- 860 https://doi.org/10.3390/drones3010023, 2019.
- 861 Calef, M. P., Varvak, A., and McGuire, A. D.: Differences in human versus lightning fires between urban and rural areas of
- the boreal forest in interior Alaska, Forests, 8, 422, https://doi.org/10.3390/f8110422, 2017.
- 863 Carter, T.S., Heald, C.L., Jimenez, J.L., Campuzano-Jost, P., Kondo, Y., Moteki, N., Schwarz, J.P., Wiedinmyer, C.,
- Darmenov, A.S., da Silva, A.M. and Kaiser, J.W.: 2020. How emissions uncertainty influences the distribution and radiative





- impacts of smoke from fires in North America, Atmos. Chem. Physics, 20: 2073–2097, https://doi.org/10.5194/acp-20-2073-
- 866 2020, 2020.
- Cartier, K. M. S.: Southern Greenland wildfire extinguished. Eos, 98, https://doi.org/10.1029/2017EO080905, 2017.
- Chang, K. Y., Riley, W. J., Crill, P. M., Grant, R. F., Rich, V. I., and Saleska, S. R.: Large carbon cycle sensitivities to climate
- across a permafrost thaw gradient in subarctic Sweden, The Cryosphere, 13, 647–663, https://doi.org/10.5194/tc-13-647-2019,
- 870 2019.
- Chernokulsky, A., and Esau, I: Cloud cover and cloud types in the Eurasian Arctic in 1936–2012. Int J Climatol, 39, 5771-
- 872 5790,https://doi.org/10.1002/joc.6187, 2019.
- 873 CIFFC: Canadian Interagency Forest Fire Centre: Fire Hectares by Year, available at: https://ciffc.net/en/ext/hectares-by-year,
- 874 2020.
- 875 Comer, B., Osipova, L., Georgeff, E., and Mao, X.: The International Maritime Organization's proposed Arctic heavy fuel oil
- ban: Likely implications and opportunities for improvement, International Council on Clean Transportation, available at:
- 877 https://theicct.org/sites/default/files/publications/Arctic-HFO-ban-sept2020.pdf, 2020.
- 878 Conard, S.G. and Ivanova, G.A.: Wildfire in Russian boreal forests—Potential impacts of fire regime characteristics on
- emissions and global carbon balance estimates, Environ. Pollut, 98, 305, https://doi.org/10.1016/S0269-7491(97)00140-1,
- 880 1997.
- 881 Conard, S.G., and Ponomarev, E.: Fire in the North, Wildfire Magazine, available at: https://www.iawfonline.org/article/fire-
- in-the-north-the-2020-siberian-fire-season/, 2020.
- 883 Cogos, S., Östlund, L. and Roturier, S.: Forest fire and indigenous Sami land use: place names, fire dynamics, and ecosystem
- change in Northern Scandinavia, Human Ecology, 47, 51-64, https://doi.org/10.1007/s10745-019-0056-9, 2019.
- Daanen, R. P., Ingeman-Nielsen, T., Marchenko, S. S., Romanovsky, V. E., Foged, N., Stendel, M., Christensen, J. H., and
- Hornbech Svendsen, K.: Permafrost degradation risk zone assessment using simulation models, The Cryosphere, 5, 1043–
- 887 1056, https://doi.org/10.5194/tc-5-1043-2011, 2011.
- Davies, G. M., Kettridge, N., Stoof, C.R., Gray, A., Ascoli, D., Fernandes, P.M., Marrs, R., Allen, K.A., Doerr, S.H., Clay,
- 889 G.D. and McMorrow, J.: The role of fire in UK peatland and moorland management: the need for informed, unbiased debate,
- 890 Philos, Trans. R. Soc. Lond., B, Biol. Sci., 371, 20150342, https://doi.org/10.1098/rstb.2015.0342, 2016.





- 891 De Groot, W. J., Flannigan, M. D., and Stocks, B. J.: Climate change and wildfires, González-Cabán, Armando, tech. coord.
- Proceedings of the fourth international symposium on fire economics, planning, and policy: climate change and wildfires,
- available at: https://www.fs.fed.us/psw/publications/documents/psw_gtr245/psw_gtr245_001.pdf, 2013.
- de Rigo, D., Libertà, G., Houston Durrant, T., Artés Vivancos, T., and San-Miguel-Ayanz, J.: Forest fire danger extremes in
- 895 Europe under climate change: variability and uncertainty, Publication Office of the European Union, Luxembourg,
- 896 https://doi.org/10.2760/13180, 2017.
- Pronin, N., and Kirilenko, A.: Climate change, food stress, and security in Russia, Reg Environ Change, 11(1), 167-178,
- 898 https://doi.org/10.1007/s10113-010-0165-x, 2011.
- 899 DSB: Direktoratet for samfunnssikkerhet og beredskap, Personal communication, March 2020, Homepage:
- 900 https://www.dsb.no/, 2020.
- Duncan, B. N., Ott, L. E., Abshire, J. B., Brucker, L., Carroll, M. L., Carton, J., et al.: Space-Based Observations for
- 902 Understanding Changes in the Arctic-Boreal Zone. Rev. Geophys., 58, e2019RG000652,
- 903 https://doi.org/10.1029/2019RG000652, 2020.
- Elmes, M. C., Thompson, D. K., Sherwood, J. H., and Price, J. S.: Hydrometeorological conditions preceding wildfire, and the
- subsequent burning of a fen watershed in Fort McMurray, Alberta, Canada, Nat. Hazards Earth Syst. Sci., 18, 157–170,
- 906 https://doi.org/10.5194/nhess-18-157-2018, 2018.
- 907 Estop-Aragonés, C., Czimczik, C. I., Heffernan, L., Gibson, C., Walker, J. C., Xu, X., and Olefeldt, D.: Respiration of aged
- 908 soil carbon during fall in permafrost peatlands enhanced by active layer deepening following wildfire but limited following
- 909 thermokarst, Environ. Res. Lett., 13, 085002, https://doi.org/10.1088/1748-9326/aad5f0, 2018.
- 910 Evangeliou, N., Kylling, A., Eckhardt, S., Myroniuk, V., Stebel, K., Paugam, R., Zibtsey, S., and Stohl, A.: Open fires in
- 911 Greenland in summer 2017: transport, deposition and radiative effects of BC, OC and BrC emissions, Atmos. Chem. Phys.,
- 912 19, 1393–1411, https://doi.org/10.5194/acp-19-1393-2019, 2019.
- 913 Flannigan, M., Cantin, A. S., De Groot, W. J., Wotton, M., Newbery, A., and Gowman, L. M.: Global wildland fire season
- severity in the 21st century, Forest Ecol Manag, 294, 54-61, https://doi.org/10.1016/j.foreco.2012.10.022, 2013.
- Foster, A.C., Armstrong, A.H., Shuman, J.K., Shugart, H.H., Rogers, B.M., Mack, M.C., Goetz, S.J., and Ranson, K.J.:
- 916 Importance of tree-and species-level interactions with wildfire, climate, and soils in interior Alaska: Implications for forest
- 917 change under a warming climate, Ecol Modell, 409, 108765, https://doi.org/10.1016/j.ecolmodel.2019.108765, 2019.





- French, N. H., Jenkins, L. K., Loboda, T. V., Flannigan, M., Jandt, R., Bourgeau-Chavez, L. L., and Whitley, M.: Fire in arctic
- 919 tundra of Alaska: past fire activity, future fire potential, and significance for land management and ecology, Int J Wildland
- 920 Fire, 24, 1045-1061, https://doi.org/10.1071/wf14167, 2015.
- Fusco, E. J., Finn, J. T., Abatzoglou, J. T., Balch, J. K., Dadashi, S., and Bradley, B. A.: Detection rates and biases of fire
- observations from MODIS and agency reports in the conterminous United States, Remote Sens. Environ., 220, 30-40,
- 923 https://doi.org/10.1016/j.rse.2018.10.028, 2019.
- 924 Gibson, C. M., Chasmer, L. E., Thompson, D. K., Quinton, W. L., Flannigan, M. D., and Olefeldt, D.: Wildfire as a major
- driver of recent permafrost thaw in boreal peatlands, Nat. Commun., 9(1), 1-9, https://doi.org/10.1038/s41467-018-05457-1 ,
- 926 2018.
- Giglio, L., Loboda, T., Roy, D. P., Quayle, B., and Justice, C. O.: An active-fire based burned area mapping algorithm for the
- 928 MODIS sensor, Remote Sens. Environ., 113, 408-420, https://doi.org/10.1016/j.rse.2008.10.006, 2009.
- 929 Giglio, L., Schroeder, W. and Justice, C.O.: The collection 6 MODIS active fire detection algorithm and fire products, Remote
- 930 Sens. Environ, 178, 31, https://doi.org/10.1016/j.rse.2016.02.054, 2016.
- 931 Giglio, L., Boschetti, L., Roy, D. P., Humber, M. L., and Justice, C. O.: The Collection 6 MODIS burned area mapping
- 932 algorithm and product, Remote Sens. Environ., 217, 72-85, https://doi.org/10.1016/j.rse.2018.08.005, 2018.
- 933 Girardin, M. P., and Terrier, A.: Mitigating risks of future wildfires by management of the forest composition: an analysis of
- 934 the offsetting potential through boreal Canada, Clim. Change, 130(4), 587-601, https://doi.org/10.1007/s10584-015-1373-7,
- 935 2015.
- 936 Gralewicz, N. J., Nelson, T. A., and Wulder, M. A.: Factors influencing national scale wildfire susceptibility in Canada, Forest
- 937 Ecol Manage, 265, 20-29, https://doi.org/10.1016/j.foreco.2011.10.031, 2012.
- Granath, G., Moore, P. A., Lukenbach, M. C., and Waddington, J. M.: Mitigating wildfire carbon loss in managed northern
- peatlands through restoration, Sci. Rep, 6(1), 1-9,https://doi.org/10.1038/srep28498, 2016.
- 940 Granström, A., and Niklasson, M.: Potentials and limitations for human control over historic fire regimes in the boreal forest,
- 941 Philos, Trans. R. Soc. Lond., B, Biol. Sci., 363, 2351-2356, https://doi.org/10.1098/rstb.2007.2205, 2008.
- 942 Groenemeijer, P., Vajda, A., Lehtonen, I., Kämäräinen, M., Venäläinen, A., Gregow, H., Becker, N., Nissen, K., Ulbrich, U.,
- Paprotny, D., & Morales Napoles, O.: Present and future probability of meteorological and hydrological hazards in Europe,





- 944 Final report of Deliverable 2.5 for the Risk Analysis of Infrastructure Networks in response to extreme weather (RAIN) project,
- 945 available at: http://rain-project.eu/wp-content/uploads/2016/09/D2.5_REPORT_final.pdf, 2016.
- 946 Gromny, E., Lewiński, S., Rybicki, M., Malinowski, R., Krupiński, M., Nowakowski, A., and Jenerowicz, M.: Creation of
- 947 training dataset for Sentinel-2 land cover classification, In Photonics Applications in Astronomy, Communications, Industry,
- and High-Energy Physics Experiments 2019 (Vol. 11176, p. 111763D), International Society for Optics and Photonics,
- available at: http://s2glc.cbk.waw.pl/, 2019.
- 950 Günther, A., Barthelmes, A., Huth, V., Joosten, H., Jurasinski, G., Koebsch, F., and Couwenberg, J.: Prompt rewetting of
- 951 drained peatlands reduces climate warming despite methane emissions, Nat. Commun., 11, 1644.
- 952 https://doi.org/10.1038/s41467-020-15499-z, 2020.
- 953 Haddaway, N.R., Bethel, A., Dicks, L.V., Koricheva, J., Macura, B., Petrokofsky, G., Pullin, A.S., Savilaakso, S. and Stewart,
- G.B.: Eight problems with literature reviews and how to fix them, Nat. Ecol. Evol., 4, 1582, https://doi.org/10.1038/s41559-
- 955 020-01295-x, 2020.
- Hall, J. V., and Loboda, T. V.: Quantifying the Potential for Low-Level Transport of Black Carbon Emissions from Cropland
- 957 Burning in Russia to the Snow-Covered Arctic, Front. Earth Sci., 5, 109, https://doi.org/10.3389/feart.2017.00109, 2017.
- Hall, J., and Loboda, T.: Quantifying the variability of potential black carbon transport from cropland burning in Russia driven
- 959 by atmospheric blocking events, Environ. Res. Lett., 13, 055010,https://doi.org/10.1088/1748-9326/aabf65, 2018.
- Hanes, C.C., Wang, X., Jain, P., Parisien, M.A., Little, J.M. and Flannigan, M.D.: Fire-regime changes in Canada over the last
- 961 half century, Can. J. For. Res., 49, 256, https://doi.org/10.1139/cjfr-2018-0293, 2019.
- Hannah, L., Roehrdanz, P.R., KC, K.B., Fraser, E.D., Donatti, C.I., Saenz, L., Wright, T.M., Hijmans, R.J., Mulligan, M.,
- Berg, A., and van Soesbergen, A.: The environmental consequences of climate-driven agricultural frontiers, PLoS One, 15,
- 964 e0228305, https://doi.org/10.1371/journal.pone.0228305, 2020.
- 965 Hayasaka, H., Sokolova, G. V., Ostroukhov, A., and Naito, D: Classification of Active Fires and Weather Conditions in the
- 966 Lower Amur River Basin, Rem. Sens., 12, 3204,https://doi.org/10.3390/rs12193204, 2020.
- 967 Helbig, M., Waddington, J.M., Alekseychik, P., Amiro, B.D., Aurela, M., Barr, A.G., Black, T.A., Blanken, P.D., Carey, S.K.,
- Chen, J. and Chi, J.: Increasing contribution of peatlands to boreal evapotranspiration in a warming climate, Nat. Clim. Chang.,
- 969 10, 555, https://doi.org/10.1038/s41558-020-0763-7, 2020.





- Hlásny, T., Krokene, P., Liebhold, A., Montagné-Huck, C., Müller, J., Qin, H., Raffa, K., Schelhaas, M., Seidl, R., Svoboda,
- M. and Viiri, H.: Living with bark beetles: impacts, outlook and management options (No. 8), European Forest Institute,
- available at: https://efi.int/sites/default/files/files/publication-bank/2019/efi_fstp_8_2019.pdf, 2019.
- Hislop, S., Haywood, A., Jones, S., Soto-Berelov, M., Skidmore, A., and Nguyen, T. H.: A satellite data driven approach to
- monitoring and reporting fire disturbance and recovery across boreal and temperate forests, Int. J Appl. Earth Obs, 87, 102034,
- 975 https://doi.org/10.1016/j.jag.2019.102034, 2020.
- 976 Höglund-Isaksson, L., Gómez-Sanabria, A., Klimont, Z., Rafaj, P., Schöpp, W.: Technical potentials and costs for reducing
- 977 global anthropogenic methane emissions in the 2050 timeframe –results from the GAINS model, Environmental Research
- 978 Communications, 2, 025004, https://doi.org/10.1088/2515-7620/ab7457, 2020.
- Holloway, J. E., Lewkowicz, A. G., Douglas, T. A., Li, X., Turetsky, M. R., Baltzer, J. L., and Jin, H.: Impact of wildfire on
- 980 permafrost landscapes: A review of recent advances and future prospects, Permafr. Periglac. Process., 31, 371,
- 981 https://doi.org/10.1002/ppp.2048, 2020.
- Hu, F.S., Higuera, P.E., Duffy, P., Chipman, M.L., Rocha, A.V., Young, A.M., Kelly, R. and Dietze, M.C.: Arctic tundra fires:
- 983 natural variability and responses to climate change, Front. Ecol. Environ., 13, 369, https://doi.org/10.1890/150063,2015.
- Hu, Y., Fernandez-Anez, N., Smith, T. E., and Rein, G.: Review of emissions from smouldering peat fires and their contribution
- to regional haze episodes, Int J Wildland Fire, 27, 293, https://doi.org/10.1071/wf17084, 2018.
- Hugelius, G., Strauss, J., Zubrzycki, S., Harden, J. W., Schuur, E. A. G., Ping, C. L., Schirrmeister, L., Grosse, G., Michaelson,
- 987 G.J., Koven, C.D., and O'Donnell, J. A.: Estimated stocks of circumpolar permafrost carbon with quantified uncertainty ranges
- 988 and identified data gaps, Biogeosciences, 11(23), 6573, https://doi.org/10.5194/bg-11-6573-2014, 2014.
- Hugelius, G., Loisel, J., Chadburn, S., Jackson, R.B., Jones, M., MacDonald, G., Marushchak, M., Olefeldt, D., Packalen, M.,
- 990 Siewert, M.B., and Treat, C.: Large stocks of peatland carbon and nitrogen are vulnerable to permafrost thaw, Proc Natl Acad
- 991 Sci, 117, 20438, https://doi.org/10.1073/pnas.1916387117, 2020.
- 992 Ichoku, C., and Ellison, L.: Global top-down smoke-aerosol emissions estimation using satellite fire radiative power
- 993 measurements, Atmos. Chem. Phys., 14, 6643, https://doi.org/10.5194/acp-14-6643-2014, 2014.
- Ingram, R. C., Moore, P. A., Wilkinson, S., Petrone, R. M., and Waddington, J. M.: Postfire soil carbon accumulation does
- 995 not recover boreal peatland combustion loss in some hydrogeological settings, J. Geophys. Res. Biogeosci., 124, 775,
- 996 https://doi.org/10.1029/2018jg004716, 2019.





- 997 Innes, R.J.: Fire regimes of Alaskan tundra communities, U.S. Department of Agriculture, Forest Service, Rocky Mountain
- 998 Research Station, Fire Sciences Laboratory (Producer), available at:
- www.fs.fed.us/database/feis/fire_regimes/AK_tundra/all.html, 2013.
- Inness, A., Ades, M., Agustí-Panareda, A., Barré, J., Benedictow, A., Blechschmidt, A.-M., Dominguez, J. J., Engelen, R.,
- 1001 Eskes, H., Flemming, J., Huijnen, V., Jones, L., Kipling, Z., Massart, S., Parrington, M., Peuch, V.-H., Razinger, M., Remy,
- 1002 S., Schulz, M., and Suttie, M.: The CAMS reanalysis of atmospheric composition, Atmos. Chem. Phys., 19, 3515–3556,
- 1003 https://doi.org/10.5194/acp-19-3515-2019, 2019.
- 1004 Ioffe, G., and Nefedova, T.: Marginal farmland in European Russia, Eurasian Geogr. Econ., 45(1), 45,
- 1005 https://doi.org/10.2747/1538-7216.45.1.45, 2004.
- 1006 IPCC Climate Change 2013: The Physical Science Basis. Contribution to the Fifth Assessment Report of the Intergovernmental
- Panel on Climate Change, edited by: Stocker, T. F., Qin, D., Plattner, G.-K., Tignor, M., Allen, S.K., Boschung, J., Nauels,
- 1008 A., Xia, Y., Bex, V. and Midgley, P.M., available at: https://www.ipcc.ch/report/ar5/wg1/, 2013.
- 1009 Ivanova, G. A., Kukavskaya, E. A., Ivanov, V. A., Conard, S. G., and McRae, D. J.: Fuel characteristics, loads and consumption
- in Scots pine forests of central Siberia, J For Res, 31, 2507, https://doi.org/10.1007/s11676-019-01038-0, 2019
- Jain, P., Tye, M. R., Paimazumder, D., and Flannigan, M.: Downscaling fire weather extremes from historical and projected
- 1012 climate models, Clim Change, 1-28, https://doi.org/10.1007/s10584-020-02865-5, 2020.
- Jenkins, M. J., Runyon, J. B., Fettig, C. J., Page, W. G., and Bentz, B. J.: Interactions among the mountain pine beetle, fires,
- and fuels, For Sci, 60, 489-501, https://doi.org/10.5849/forsci.13-017, 2014.
- Jiang, Y., Rocha, A. V., O'Donnell, J. A., Drysdale, J. A., Rastetter, E. B., Shaver, G. R., and Zhuang, Q.: Contrasting soil
- 1016 thermal responses to fire in Alaskan tundra and boreal forest, J. Geophys. Res. Earth. Surf., 120, 363,
- 1017 https://doi.org/10.1002/2014jf003180, 2015.
- Johnston, D. C., Turetsky, M. R., Benscoter, B. W., and Wotton, B. M.: Fuel load, structure, and potential fire behaviour in
- black spruce bogs, Can J Forest Res, 45, 888, https://doi.org/10.1139/cjfr-2014-0334, 2015.
- Johnston, J. M., Johnston, L. M., Wooster, M. J., Brookes, A., McFayden, C., and Cantin, A. S.: Satellite detection limitations
- of sub-canopy smouldering wildfires in the North American Boreal Forest, Fire, 1, 28, https://doi.org/10.3390/fire1020028,
- 1022 2018.





- Johnston, L.M., Wang, X., Erni, S., Taylor, S.W., McFayden, C.B., Oliver, J.A., Stockdale, C., Christianson, A., Boulanger,
- 1024 Y., Gauthier, S., and Arseneault, D.: Wildland fire risk research in Canada, Environ. Rev., 28, 164,
- 1025 https://dx.doi.org/10.1139/er-2019-0046, 2020.
- Jones, B.M., Breen, A.L., Gaglioti, B.V., Mann, D.H., Rocha, A.V., Grosse, G., Arp, C.D., Kunz, M.L. and Walker, D.A.:
- 1027 Identification of unrecognized tundra fire events on the north slope of Alaska, J. Geophys. Res. Biogeosci., 118, 1334,
- 1028 https://doi.org/10.1002/jgrg.20113, 2013.
- Jones, B. M., Grosse, G., Arp, C. D., Miller, E., Liu, L., Hayes, D. J., and Larsen, C. F.: Recent Arctic tundra fire initiates
- widespread thermokarst development, Sci. Rep., 5, 15865, https://doi.org/10.1038/srep15865, 2015.
- 1031 Kaiser, J.W., Heil, A., Andreae, M.O., Benedetti, A., Chubarova, N., Jones, L., Morcrette, J.J., Razinger, M., Schultz, M.G.,
- Suttie, M., and Van Der Werf, G.R.: Biomass burning emissions estimated with a global fire assimilation system based on
- observed fire radiative power, Biogeosciences, 9, 527-554, https://doi.org/10.5194/bg-9-527-2012, 2012.
- Karjalainen, O., Aalto, J., Luoto, M., Westermann, S., Romanovsky, V.E., Nelson, F.E., Etzelmüller, B. and Hjort, J.:
- 1035 Circumpolar permafrost maps and geohazard indices for near-future infrastructure risk assessments, Scientific Data, 6, 190037,
- 1036 https://doi.org/10.1038/sdata.2019.37, 2019.
- 1037 Keegan, K. M., Albert, M. R., McConnell, J. R., and Baker, I.: Climate change and forest fires synergistically drive widespread
- 1038 melt events of the Greenland Ice Sheet. Proc. Natl. Acad. Sci., 111, 7964, https://doi.org/10.1073/pnas.1405397111, 2014.
- 1039 Kellomäki, S., Strandman, H., Heinonen, T., Asikainen, A., Venäläinen, A., and Peltola, H.: Temporal and spatial change in
- diameter growth of boreal Scots pine, Norway spruce, and birch under recent-generation (CMIP5) global climate model
- projections for the 21st century. Forests, 9, 118, https://doi.org/10.3390/f9030118, 2018.
- 1042 Ketola, J.: Forest fire activity and burned area for Finland, Emergency Services Academy, Personal communication to Henrik
- Lindberg, based on rescue service database PRONTO, available at: https://prontonet.fi/Pronto3/online3/Online7ilastot.htm,
- 1044 2020.
- 1045 Klimont, Z., Kupiainen, K., Heyes, C., Purohit, P., Cofala, J., Rafaj, P., Borken-Kleefeld, J., and Schöpp, W.: Global
- 1046 anthropogenic emissions of particulate matter including black carbon. Atmos. Chem. Phys., 17, 8681,
- 1047 https://doi.org/10.5194/acp-17-8681-2017, 2017.
- 1048 Kharuk, V. I., Im, S.T., Ranson, K.J., and Yagunov, M.N.: Climate-Induced Northerly Expansion of Siberian Silkmoth Range,
- 1049 Forests, 8, 301, https://doi.org/10.3390/f8080301, 2017.





- 1050 Kharuk, V.I., Ponomarev, E.I., Ivanova, G.A., Dvinskaya, M.L., Coogan, S.C. and Flannigan, M.D.: Wildfires in the Siberian
- taiga, Ambio, 1, 1-22, https://doi.org/10.1007/s13280-020-01490-x, 2021.
- 1052 Kieft, J., Smith, T., Someshwar, S., and Boer, R.: Towards Anticipatory Management of Peat Fires to Enhance Local Resilience
- and Reduce Natural Capital Depletion, Ecosystem-Based Disaster Risk Reduction and Adaptation in Practice, Springer, 2016.
- Kiely, L., Spracklen, D. V., Wiedinmyer, C., Conibear, L., Reddington, C. L., Archer-Nicholls, S., Lowe, D., Arnold, S. R.,
- 1055 Knote, C., Khan, M. F., Latif, M. T., Kuwata, M., Budisulistiorini, S. H., and Syaufina, L.: New estimate of particulate
- emissions from Indonesian peat fires in 2015, Atmos. Chem. Phys., 19, 11105–11121, https://doi.org/10.5194/acp-19-11105-
- 1057 2019f, 2019.
- King, M., Altdorff, D., Li, P., Galagedara, L., Holden, J., and Unc, A.: Northward shift of the agricultural climate zone under
- 1059 21 st-century global climate change, Sci. Rep., 8, 7904, https://doi.org/10.1038/s41598-018-26321-8, 2018.
- 1060 Kim, J. S., Kug, J. S., Jeong, S. J., Park, H., and Schaepman-Strub, G.: Extensive fires in southeastern Siberian permafrost
- linked to preceding Arctic Oscillation, Sci. Adv., 6, eaax3308, https://doi.org/10.1126/sciadv.aax3308, 2020.
- 1062 Kirchmeier-Young, M. C., Gillett, N. P., Zwiers, F. W., Cannon, A. J., and Anslow, F. S.: Attribution of the Influence of
- Human-Induced Climate Change on an Extreme Fire Season, Earths Future, 7, 2, https://doi.org/10.1029/2018ef001050, 2019.
- Kirillina, K., Shvetsov, E. G., Protopopova, V. V., Thiesmeyer, L., and Yan, W.: Consideration of anthropogenic factors in
- boreal forest fire regime changes during rapid socio-economic development: case study of forestry districts with increasing
- burnt area in the Sakha Republic, Russia. Environ. Res. Lett., 15, 035009, https://doi.org/10.1088/1748-9326/ab6c6e, 2020.
- 1067 Knorr, W., Dentener, F., Hantson, S., Jiang, L., Klimont, Z., and Arneth, A.: Air quality impacts of European wildfire emissions
- in a changing climate, Atmos. Chem. Phys., 16, 5685, https://doi.org/10.5194/acp-16-5685-2016, 2016.
- 1069 Koster, R. D., Darmenov, A. S., and da Silva, A. M.: The Quick Fire Emissions Dataset (QFED): Documentation of Versions
- 1070 2.1, 2.2 and 2.4, Technical Report Series on Global Modeling and Data Assimilation, available at:
- 1071 https://ntrs.nasa.gov/search.jsp?R=20180005253, 2015.
- 1072 Kotlyakov, V. and Khromova, T.: Land Resources of Russia Maps of Permafrost and Ground Ice, Boulder, Colorado USA:
- National Snow and Ice Data Center, available at: https://nsidc.org/data/GGD600/versions/1, 2002.
- 1074 Krause, A., Kloster, S., Wilkenskjeld, S., and Paeth, H.: The sensitivity of global wildfires to simulated past, present, and
- 1075 future lightning frequency, J. Geophys. Res. Biogeosci., 119, 312, https://doi.org/10.1002/2013jg002502, 2014.





- 1076 Krawchuk, M. A., Moritz, M. A., Parisien, M. A., Van Dorn, J., and Hayhoe, K.: Global pyrogeography: the current and future
- 1077 distribution of wildfire, PLOS ONE, 4, e5102, https://doi.org/10.1371/journal.pone.0005102, 2009.
- 1078 Krawchuk, M.A., and Moritz, M.A.: Constraints on global fire activity vary across a resource gradient, Ecology, 92, 121,
- 1079 https://doi.org/10.1890/09-1843, 2011.
- 1080 Krylov, A., McCarty, J. L., Potapov, P., Loboda, T., Tyukavina, A., Turubanova, S., and Hansen, M. C.: Remote sensing
- estimates of stand-replacement fires in Russia, 2002-2011, Environ. Res. Lett., 9, 105007, https://doi.org/10.1088/1748-
- 1082 9326/9/10/105007, 2014.
- 1083 Kukavskaya, E. A., Soja, A. J., Petkov, A. P., Ponomarev, E. I., Ivanova, G. A., and Conard, S. G.: Fire emissions estimates
- in Siberia: evaluation of uncertainties in area burned, land cover, and fuel consumption, Can. J. Forest Res., 43, 493,
- 1085 https://doi.org/10.1139/cjfr-2012-0367, 2013.
- 1086 Kukavskaya, E.A., Buryak, L.V., Shvetsov, E.G., Conard, S.G. and Kalenskaya, O.P.: The impact of increasing fire frequency
- on forest transformations in southern Siberia, Forest Ecol. Manag., 382, 225, https://doi.org/10.1016/j.foreco.2016.10.015,
- 1088 2016.
- Lamarque, J.-F., Bond, T. C., Eyring, V., Granier, C., Heil, A., Klimont, Z., Lee, D., Liousse, C., Mieville, A., Owen, B.,
- Schultz, M. G., Shindell, D., Smith, S. J., Stehfest, E., Van Aardenne, J., Cooper, O. R., Kainuma, M., Mahowald, N.,
- 1091 McConnell, J. R., Naik, V., Riahi, K., and van Vuuren, D. P.: Historical (1850-2000) gridded anthropogenic and biomass
- burning emissions of reactive gases and aerosols: methodology and application, Atmos. Chem. Phys., 10, 7017-7039,
- 1093 https://doi.org/10.5194/acp-10-7017-2010, 2010.
- Lara, M.J., McGuire, A.D., Euskirchen, E.S., Genet, H., Yi, S., Rutter, R., Iversen, C., Sloan, V. and Wullschleger, S.D.:
- 1095 Local-scale Arctic tundra heterogeneity affects regional-scale carbon dynamics, Nat Commun, 11, 4925,
- 1096 https://doi.org/10.1038/s41467-020-18768-z, 2020.
- Larjavaara, M., Kuuluvainen, T., and Rita, H.: Spatial distribution of lightning-ignited forest fires in Finland, Forest Ecol.
- 1098 Manag., 208, 177, https://doi.org/10.1016/j.foreco.2004.12.005, 2005.
- 1099 K. S., Law, and Stohl, A.: Arctic pollution: Origins impacts, Science, 315, 1537, air and
- 1100 https://doi.org/10.1126/science.1137695, 2007.
- Lawrence, D. M., and Slater, A. G.: A projection of severe near-surface permafrost degradation during the 21st century,
- Geophys. Res. Lett, 32,L24401, https://doi.org/10.1029/2005GL025080, 2005.





- Lee, S. H., Lawrence, Z. D., Butler, A. H., and Karpechko, A. Y.: Seasonal Forecasts of the Exceptional Northern Hemisphere
- 1104 Winter of 2020, Geophys. Res. Lett., e2020GL090328, https://doi.org/10.1029/2020GL090328, 2020.
- Lehtonen, I., Venäläinen, A., Kämäräinen, M., Peltola, H., and Gregow, H.: Risk of large-scale fires in boreal forests of Finland
- under changing climate, Natural Hazards Earth Syst. Sci., 16, 239, https://doi.org/10.5194/nhess-16-239-2016, 2016.
- 1107 Lidskog, R., Johansson, J., and Sjödin, D.: Wildfires, responsibility and trust: public understanding of Sweden's largest
- 1108 wildfire, Scand. J. For. Res., 34, 319, https://doi.org/10.1080/02827581.2019.1598483, 2019.
- 1109 Lindberg, H., Punttila, P., and Vanha-Majamaa, I.: The challenge of combining variable retention and prescribed burning in
- 1110 Finland, Ecological Processes, 9, 4, https://doi.org/10.1186/s13717-019-0207-3, 2020.
- Little, J. M., Jandt, R. R., Drury, S., Molina, A., and Lane, B.: Evaluating the effectiveness of fuel treatments in Alaska-Final
- Report to the Joint Fire Science Program, JFSP Project No. 14-5-01-27, University of Alaska-Fairbanks, available at:
- 1113 https://www.fs.fed.us/psw/pubs/58856, 2018.
- Liu, T., Mickley, L. J., Marlier, M. E., DeFries, R. S., Khan, M. F., Latif, M. T., and Karambelas, A.: Diagnosing spatial biases
- and uncertainties in global fire emissions inventories: Indonesia as regional case study, Remote Sens. Environ., 237, 111557,
- 1116 https://doi.org/10.31223/osf.io/nh57j, 2020.
- 1117 Loboda, T. V., Hall, J.V., Hall, A.H., and Shevade, V.S.: ABoVE: Cumulative Annual Burned Area, Circumpolar High
- Northern Latitudes, 2001-2015, available at: https://daac.ornl.gov/cgi-bin/dsviewer.pl?ds_id=1526, ORNL DAAC, Oak
- 1119 Ridge, TN, USA, https://doi.org/10.3334/ORNLDAAC/1526, 2017.
- 1120 Loepfe, L., Lloret, F., and Román-Cuesta, R. M.: Comparison of burnt area estimates derived from satellite products and
- national statistics in Europe, Int J Remote Sens, 33, 3653, https://doi.org/10.1080/01431161.2011.631950, 2012.
- Loranty, M. M., Lieberman-Cribbin, W., Berner, L. T., Natali, S. M., Goetz, S. J., Alexander, H. D., and Kholodov, A. L.:
- 1123 Spatial variation in vegetation productivity trends, fire disturbance, and soil carbon across arctic-boreal permafrost ecosystems,
- 1124 Environ. Res. Lett., 11, 095008, https://doi.org/10.1088/1748-9326/11/9/095008, 2016.
- 1125 Malevsky-Malevich, S.P., Molkentin, E.K., Nadyozhina, E.D. and Shklyarevich, O.B.: Numerical simulation of permafrost
- 1126 parameters distribution in Russia, Cold Reg Sci Technol, 32, 1-11, https://doi.org/10.1016/s0165-232x(01)00018-0, 2001.
- Markuse, P.: Before/After Comparison of the July/August 2019 Greenland Wildfire: Analysis from Sentinel-2, available at:
- https://pierre-markuse.net/2019/08/19/before-after-comparison-of-the-july-august-2019-greenland-wildfire/, 2019.





- McCarty, J. L., Krylov, A., Prishchepov, A. V., Banach, D. M., Tyukavina, A., Potapov, P., and Turubanova, S.: Agricultural
- fires in European Russia, Belarus, and Lithuania and their impact on air quality, 2002–2012, In Land-Cover and Land-Use
- 1131 Changes in Eastern Europe after the Collapse of the Soviet Union in 1991, Springer, 2017.
- 1132 McCarty, J. L., Smith, T. E., and Turetsky, M. R.: Arctic fires re-emerging, Nat. Geosci., 13, 658,
- 1133 https://doi.org/10.1038/s41561-020-00645-5, 2020.
- 1134 McGwinn, K.: Hikers warned as Greenland wildfire burns out of control, Arctic Today, available at:
- https://www.arctictoday.com/hikers-warned-as-greenland-wildfire-burns-out-of-control/, 2019.
- McWethy, D. B., Schoennagel, T., Higuera, P. E., Krawchuk, M., Harvey, B. J., Metcalf, E. C., Schultz, C., Miller, C., Metcalf,
- 1137 A.L., Buma, B. and Virapongse, A.: Rethinking resilience to wildfire, Nat. Sustain, 2, 797, https://doi.org/10.1038/s41893-
- 1138 019-0353-8, 2019.
- Mekonnen, Z.A., Riley, W.J., Randerson, J.T., Grant, R.F., and Rogers. B.M.: Expansion of high-latitude deciduous forests
- driven by interactions between climate warming and fire, Nat. Plants, 5, 952, https://doi.org/10.1038/s41477-019-0495-8,
- 1141 2019.
- Michaelides, R. J., Schaefer, K., Zebker, H. A., Parsekian, A., Liu, L., Chen, J., Natali, S., Ludwig, S. and Schaefer, S.R.:
- 1143 Inference of the impact of wildfire on permafrost and active layer thickness in a discontinuous permafrost region using the
- remotely sensed active layer thickness (ReSALT) algorithm, Environ. Res. Lett., 14, 035007, https://doi.org/10.1088/1748-
- 1145 9326/aaf932, 2019.
- Mieville, A., Granier, C., Liousse, C., Guillaume, B., Mouillot, F., Lamarque, J.F., Grégoire, J.M. and Pétron, G.: Emissions
- of gases and particles from biomass burning during the 20th century using satellite data and an historical reconstruction, Atmos.
- Environ., 44, 1469, https://doi.org/10.1016/j.atmosenv.2010.01.011, 2010.
- Miller, M. E., Billmire, M., Bourgeau-Chavez, L., Elliot, W. J., Robichaud, P. R., and MacDonald, L.: Rapid response tools
- and datasets for post-fire modeling in Boreal and Arctic Environments, Spring 2017 AFSC Remote Sensing Workshop:
- 1151 Opportunities to Apply Remote Sensing in Boreal/Arctic Wildfire Management and Science, available at:
- https://digitalcommons.mtu.edu/mtri p/290, 2017.
- 1153 Mölders, N., and Kramm, G.: Climatology of Air Quality in Arctic Cities—Inventory and Assessment, Open Journal of Air
- Pollution, 7(1), 48-93, https://doi.org/10.4236/ojap.2018.71004, 2018.





- Molinari, C., Lehsten, V., Blarquez, O., Carcaillet, C., Davis, B.A., Kaplan, J.O., Clear, J. and Bradshaw, R.H.: The climate,
- the fuel and the land use: Long-term regional variability of biomass burning in boreal forests, Glob Chang Biol., 24, 4929-
- 4945, https://doi.org/10.1111/gcb.14380, 2018.
- 1158 Montesano, P.M., Neigh, C.S., Macander, M., Feng, M. and Noojipady, P.: The bioclimatic extent and pattern of the cold edge
- of the boreal forest: the circumpolar taiga-tundra ecotone, Environ. Res. Lett., 15, 105019,https://doi.org/10.1088/1748-
- 1160 9326/abb2c7, 2020.
- Morin, P., Porter, C., Cloutier, M., Howat, I., Noh, M.J., Willis, M., Bates, B., Willamson, C. and Peterman, K.: ArcticDEM:
- 1162 a publically available, high resolution elevation model of the Arctic, available at:
- https://livingatlas2.arcgis.com/arcticdemexplorer/, 2016.
- Mottershead, K.D., McGee, T.K. and Christianson, A.: Evacuating a First Nation Due to Wildfire Smoke: The Case of Dene
- Tha' First Nation, Int J Disaster Risk Sci 11, 274, https://doi.org/10.1007/s13753-020-00281-y, 2020.
- 1166 NIFC: National Interagency Fire Center: Total Wildland Fires and Acres (1926-2019), available at
- https://www.nifc.gov/fireInfo/fireInfo_stats_totalFires.html, 2019.
- Nikolakis, W., Roberts, E., Hotte, N. and Ross, R.M.: Goal setting and Indigenous fire management: a holistic perspective, Int
- J Wildland Fire, 29, 974, https://doi.org/10.1071/WF20007, 2020.
- Nitzbon, J., Westermann, S., Langer, M., Martin, L. C., Strauss, J., Laboor, S., and Boike, J.: Fast response of cold ice-rich
- permafrost in northeast Siberia to a warming climate, Nat Commun, 11, 2201, https://doi.org/10.1038/s41467-020-15725-8,
- 1172 2020.
- Nordregio.: Indigenous population in the Arctic, available at: https://nordregio.org/maps/indigenous-population-in-the-arctic/,
- 1174 2019.
- Nugent, K. A., Strachan, I. B., Roulet, N. T., Strack, M., Frolking, S., and Helbig, M.: Prompt active restoration of peatlands
- substantially reduces climate impact, Environ. Res. Lett., 14, 124030, https://doi.org/10.1088/1748-9326/ab56e6, 2019.
- Oliva, P. and Schroeder, W.: Assessment of VIIRS 375 m active fire detection product for direct burned area mapping, Remote
- 1178 Sens. Environ., 160, 144, https://doi.org/10.1016/j.rse.2015.01.010, 2015.
- Overland, J. E., and Wang, M.: The 2020 Siberian Heat Wave, Int J Climatol, https://doi.org/10.1002/joc.6850, 2020.





- Pan, X., Ichoku, C., Chin, M., Bian, H., Darmenov, A., Colarco, P., Ellison, L., Kucsera, T., da Silva, A., Wang, J., Oda, T.,
- and Cui, G.: Six global biomass burning emission datasets: intercomparison and application in one global aerosol model,
- Atmos. Chem. Phys., 20, 969–994, https://doi.org/10.5194/acp-20-969-2020, 2020.
- Parfenova, E., Tchebakova, N., and Soja, A.: Assessing landscape potential for human sustainability and 'attractiveness' across
- Asian Russia in a warmer 21st century, Environ. Res. Lett., 14, 065004, https://doi.org/10.1088/1748-9326/ab10a8, 2019.
- Parisien, M. A., Miller, C., Parks, S. A., DeLancey, E. R., Robinne, F. N., and Flannigan, M. D.: The spatially varying influence
- of humans on fire probability in North America, Environ. Res. Lett., 11, 075005, https://doi.org/10.1088/1748-
- 1187 9326/11/7/075005, 2016.
- Parisien, M.A., Barber, Q.E., Hirsch, K.G., Stockdale, C.A., Erni, S., Wang, X., Arseneault, D. and Parks, S.A.: Fire deficit
- 1189 increases wildfire risk for many communities in the Canadian boreal forest, Nat Commun, 11, 2121,
- 1190 https://doi.org/10.1038/s41467-020-15961-y, 2020.
- Partain Jr, J.L., Alden, S., Strader, H., Bhatt, U.S., Bieniek, P.A., Brettschneider, B.R., Walsh, J.E., Lader, R.T., Olsson, P.Q.,
- Rupp, T.S., and Thoman Jr, R.L.:. An assessment of the role of anthropogenic climate change in the Alaska fire season of
- 1193 2015, Bull Am Meteorol Soc, 97, S14, https://doi.org/10.1175/bams-d-16-0149.1, 2016.
- Peltola, H., Kilpeläinen, A., and Kellomäki, S.: Diameter growth of Scots pine (Pinus sylvestris) trees grown at elevated
- 1195 temperature and carbon dioxide concentration under boreal conditions, Tree Physiol, 22, 963-972,
- 1196 https://doi.org/10.1093/treephys/22.14.963, 2002.
- 1197 ФБУ «Авиалесоохрана»: Сведения о лесопожарной обстановке на территории субъектов РФ на 31.12, available at:
- 1198 https://aviales.ru/files/documents/2019/fds_svedeniya/%D1%81%D0%B2%D0%B5%D0%B4%D0%B5%D0%BD%D0%B
- 1199 8%D1%8F%20%D0%BE%20%D0%BB%D0%B5%D1%81%D0%BE%D0%BF%D0%BE%D0%B6%D0%B0%D1%80%
- 1200 D0%BD%D0%BE%D0%B9%20%D0%BE%D0%B1%D1%81%D1%82%D0%B0%D0%BD%D0%BE%D0%B2%D0%B
- 1201 A%D0%B5%20%D0%BD%D0%B0%20%D1%82%D0%B5%D1%80%D1%80%D0%B8%D1%82%D0%BE%D1%80%D
- $\frac{0\%B8\%D0\%B8\%20\%D1\%81\%D1\%83\%D0\%B1\%D1\%8A\%D0\%B5\%D0\%BA\%D1\%82\%D0\%BE\%D0\%B2\%20\%D1\%88}{20\%D1\%81\%D1\%83\%D0\%B1\%D1\%8A\%D0\%B5\%D0\%BA\%D1\%82\%D0\%BE\%D0\%B2\%20\%D1\%88}$
- 1203 0%D1%84%20%D0%BD%D0%B0%2031.12.2019.pdf, 2019.
- Pickell, P. D., Coops, N. C., Ferster, C. J., Bater, C. W., Blouin, K. D., Flannigan, M. D., and Zhang, J.: An early warning
- 1205 system to forecast the close of the spring burning window from satellite-observed greenness, Scientific Rep. 7, 1-10,
- 1206 https://doi.org/10.1038/s41598-017-14730-0, 2017.





- 1207 Pimentel, R., and Arheimer, B.: Hydrological impacts of a wildfire in a Boreal region: The Västmanland fire 2014 (Sweden),
- 1208 Sci. Total Environ. 756, 143519, https://doi.org/10.1016/j.scitotenv.2020.143519, 2021.
- Polikarpov, N.P., Andreeva, N.M., Nazimova, D.I., Sirotinina, A.V. and Sofronov, M.A.: Formation composition of the forest
- 1210 zones in Siberia as a reflection of forest-forming tree species interrelations, Russ J For Sci, 5, 3-11, 1998.
- 1211 Púčik, T., Groenemeijer, P., Rädler, A.T., Tijssen, L., Nikulin, G., Prein, A.F., van Meijgaard, E., Fealy, R., Jacob, D., and
- 1212 Teichmann, C.: Future changes in European severe convection environments in a regional climate model ensemble, J Clim,
- 30, 6771, https://doi.org/10.1175/jcli-d-16-0777.1, 2017.
- 1214 Pureswaran, D. S., Roques, A., and Battisti, A.: Forest insects and climate change, Curr. For. Rep., 4,
- 1215 35,https://doi.org/10.1007/s40725-018-0075-6, 2018.
- 1216 Qi, L., and Wang, S.: Sources of black carbon in the atmosphere and in snow in the Arctic, Sci Total Environ, 691, 442-454,
- 1217 https://doi.org/10.1016/j.scitotenv.2019.07.073, 2019.
- Raynolds, M.K., Walker, D.A., Balser, A., Bay, C., Campbell, M., Cherosov, M.M., Daniëls, F.J.A., Eidesen, P.B., Ermokhina,
- 1219 K.A., Frost, G.V., Jedrzejek, B., Jorgenson, M.T., Kennedy, B.E., Kholod, S.S., Lavrinenko, I.A., Lavrinenko, O.V.,
- Magnússon, B., Matveyeva, N.V., Metúsalemsson, S., Nilsen, L., Olthof, I., Pospelov, I.N., Pospelova, E.B., Pouliot, D.,
- Razzhivin, V., Schaepman-Strub, G., Šibík, J., Telyatnikov, M.Y., Troeva, E.: A raster version of the Circumpolar Arctic
- 1222 Vegetation Map (CAVM), Remote Sens Environ, 232, 111297, https://doi.org/10.1016/j.rse.2019.111297, 2019.
- Rein, G., Cleaver, N., Ashton, C., Pironi, P., and Torero, J. L.: The severity of smouldering peat fires and damage to the forest
- soil. Catena, 74(3), 304-309, https://doi.org/10.1016/j.catena.2008.05.008,2008.
- Rein, G.: Smoldering combustion, in: SFPE Handbook of Fire Protection Engineering, edited by: Hurley, M.J., Gottuk, D.,
- Hall, J.R., Harada, K., Kuligowski, E., Puchovsky, M., Torero, J., Watts, J.M., and C. Wieczoreks, C., Springer New York,
- 1227 New York, New York, 581–603, https://doi.org/10.1007/978-1-4939-2565-0 19, 2016.
- 1228 Rémy, S., Veira, A., Paugam, R., Sofiev, M., Kaiser, J. W., Marenco, F., Burton, S. P., Benedetti, A., Engelen, R. J., Ferrare,
- 1229 R., and Hair, J. W.: Two global data sets of daily fire emission injection heights since 2003, Atmos. Chem. Phys., 17, 2921–
- 1230 2942, https://doi.org/10.5194/acp-17-2921-2017, 2017.
- Reyer, C.P., Bathgate, S., Blennow, K., Borges, J.G., Bugmann, H., Delzon, S., Faias, S.P., Garcia-Gonzalo, J., Gardiner, B.,
- 1232 Gonzalez-Olabarria, J.R. and Gracia, C.: Are forest disturbances amplifying or canceling out climate change-induced
- 1233 productivity changes in European forests?, Environ. Res. Lett., 12, 034027, https://doi.org/10.1088/1748-9326/aa5ef1, 2017.





- 1234 Riley, K. L., Williams, A. P., Urbanski, S. P., Calkin, D. E., Short, K. C., and O'Connor, C. D.: Will Landscape Fire Increase
- in the Future? A Systems Approach to Climate, Fire, Fuel, and Human Drivers. Curr. Pollut. Rep., 5, 9,
- 1236 https://doi.org/10.1007/s40726-019-0103-6, 2019.
- Robinne, F. N., Parisien, M. A., and Flannigan, M.: Anthropogenic influence on wildfire activity in Alberta, Canada, Int J
- 1238 Wildland Fire, 25(11), 1131-1143, https://doi.org/10.1071/wf16058, 2016.
- Robinne, F. N., Hallema, D. W., Bladon, K. D., and Buttle, J. M: Wildfire impacts on hydrologic ecosystem services in North
- American high-latitude forests: A scoping review, J Hydrol., 581, 124360, https://doi.org/10.1016/j.jhydrol.2019.124360,
- 1241 2020.
- Rocha, A.V., Loranty, M.M., Higuera, P.E., Mack, M.C., Hu, F.S., Jones, B.M., Breen, A.L., Rastetter, E.B., Goetz, S.J. and
- 1243 Shaver, G.R.: The footprint of Alaskan tundra fires during the past half-century: implications for surface properties and
- radiative forcing, Environ. Res. Lett., 7, 044039, https://doi.org/10.1088/1748-9326/7/4/044039, 2012.
- Rogers, B.M., Veraverbeke, S., Azzari, G., Czimczik, C.I., Holden, S.R., Mouteva, G.O., Sedano, F., Treseder, K.K. and
- Randerson, J.T.: Quantifying fire-wide carbon emissions in interior Alaska using field measurements and Landsat imagery, J.
- 1247 of Geophys. Res. Biogeosci., 119, 1608, https://doi.org/10.1002/2014JG002657, 2014.
- Rogers, B. M., Soja, A.J., Goulden, M.L., and Randerson, J.T.: Influence of tree species on continental differences in boreal
- fires and climate feedbacks, Nature Geosci, 8, 228, https://doi.org/10.1038/ngeo2352, 2015.
- 1250 Rogers, B.M., Balch, J.K., Goetz, S.J., Lehmann, C.E. and Turetsky, M.: Focus on changing fire regimes: interactions with
- climate, ecosystems, and society, Environ. Res. Lett., 15, p.030201, https://doi.org/10.1088/1748-9326/ab6d3a, 2020.
- Ronkainen, T., Väliranta, M., and Tuittila, E.-S.: Fire pattern in a drainage-affected boreal bog, Boreal Environ Res, 18, 309,
- 1253 2013.
- Schmale, J., Arnold, S.R., Law, K.S., Thorp, T., Anenberg, S., Simpson, W.R., Mao, J., and Pratt, K.A.: Local Arctic air
- pollution: A neglected but serious problem, Earth's Future, 6, 1385, https://doi.org/10.1029/2018EF000952, 2018.
- 1256 Scholten, R., and Veraverbeke, S.: Alaska Fire Science Consortium: Spatiotemporal patterns of overwintering fire in Alaska,
- available at: https://akfireconsortium.files.wordpress.com/2020/03/fsh 2020mar25 holdoverfires-1.pdf, 2020.
- Seidl, R., Schelhaas, M. J., Rammer, W., and Verkerk, P. J.: Increasing forest disturbances in Europe and their impact on
- 1259 carbon storage, Nature Clim. Chang., 4, 806-810, https://doi.org/10.1038/nclimate2318, 2014.





- 1260 Sherstyukov, B. G., and Sherstyukov, A. B.: Assessment of increase in forest fire risk in Russia till the late 21st century based
- 1261 on scenario experiments with fifth-generation climate models, Russ Meteorol Hydro+, 39, 292,
- 1262 https://doi.org/10.3103/s1068373914050021, 2014.
- 1263 Shiwakoti, S., Zheljazkov, V. D., Gollany, H. T., Kleber, M., Xing, B., and Astatkie, T. (2019). Micronutrients in the Soil and
- Wheat: Impact of 84 Years of Organic or Synthetic Fertilization and Crop Residue Management, Agronomy, 9, 464,
- 1265 https://doi.org/10.3390/agronomy9080464, 2019.
- 1266 Shuman, J.K., Foster, A.C., Shugart, H.H., Hoffman-Hall, A., Krylov, A., Loboda, T., Ershov, D. and Sochilova, E.: Fire
- 1267 disturbance and climate change: implications for Russian forests, Environ. Res. Lett., 12, 035003,
- 1268 https://doi.org/10.1088/1748-9326/aa5eed, 2017.
- 1269 Shumilova, L.V..: Botanical Geography of Siberia, Tomsk University Press, Tomsk, USSR, 1962.
- 1270 Shvetsov, E. G., Kukavskaya, E. A., Buryak, L. V., and Barrett, K.: Assessment of post-fire vegetation recovery in Southern
- 1271 Siberia using remote sensing observations, Environ. Res. Lett., 14, 055001, https://doi.org/10.1088/1748-9326/ab083d, 2019.
- 1272 Sidorova, E. J.: The incorporation of Traditional Ecological Knowledge in the Arctic Council: Lip service?, Polar Rec (Gr
- Brit), 56, e28, https://doi.org/10.1017/S0032247420000273, 2020.
- 1274 Silva, J. S., and Harrison, S. P.: Humans, Climate and Land Cover as Controls on European Fire Regimes, in Towards
- integrated fire management-Outcomes of the European Project Fire Paradox, edited by: Silva, J.S., Rego, F.C., Fernandes, P.,
- and Rigolot, E. European Forest Institute, Joensuu, Finald, 49-59, 2010.
- 1277 Sirin, A., Maslov, A., Medvedeva, M., Vozbrannaya, A., Valyaeva, N., Tsyganova, O., Glukhova, T., and Makarov, D.:
- 1278 Multispectral Remote Sensing Data as a Tool for Assessing the Need and the Effectiveness for Peatland Restoration, In
- 1279 Proceedings of the 9th European Conference on Ecological Restoration, edited by: Tolvanen, A., Hekkala, A.M., Finnish
- Forest Research Institute, Oulu, Finland, 133, 2014.
- 1281 Sirin, A., Medvedeva, M., Maslov, A., and Vozbrannaya, A.: Assessing the Land and Vegetation Cover of Abandoned Fire
- 1282 Hazardous and Rewetted Peatlands: Comparing Different Multispectral Satellite Data, Land, 7, 71,
- 1283 https://doi.org/10.3390/land7020071, 2018.
- 1284 Sizov, O., Ezhova, E., Tsymbarovich, P., Soromotin, A., Prihod'ko, N., Petäjä, T., Zilitinkevich, S., Kulmala, M., Bäck, J., and
- 1285 Köster, K.: Fire and vegetation dynamics in northwest Siberia during the last 60 years based on high-resolution remote sensing,
- 1286 Biogeosciences, 18, 207–228, https://doi.org/10.5194/bg-18-207-2021, 2021.





- 1287 Sjöström, J., Plathner, F. V., and Granström, A.: Wildfire ignition from forestry machines in boreal Sweden, Int J Wildland
- 1288 Fire, 28, 666, https://doi.org/10.1071/wf18229, 2019.
- 1289 Smirnov, N. S., Korotkov, V. N., and Romanovskaya, A. A.: Black carbon emissions from wildfires on forest lands of the
- Russian Federation in 2007–2012, Russ Meteorol Hydro+, 40, 435, https://doi.org/10.3103/s1068373915070018, 2015.
- 1291 Sofronov, M.A., Volokitina, A.V. and Shvidenko, A.Z.: Wildland fires in the north of Central Siberia, Commonw. For. Rev.,
- 1292 77, 124, 1998.
- 1293 Sofronov, M. A., Volokitina, A., Kajimoto, T., Matsuura, Y., and Uemura, S.: Zonal peculiarities of forest vegetation
- 1294 controlled by fires in northern Siberia, Eurasian Journal of Forest Research, 1, 51, 2000.
- 1295 Sofronov, M.A., and Volokitina A.V.: Wildfire Ecology in Continuous Permafrost Zone. In Permafrost Ecosystems, Ecological
- 1296 Studies (Analysis and Synthesis), vol 209, edited by: Osawa, A., Zyryanova, O., Matsuura, Y., Kajimoto, T., and Wein, R.,
- 1297 Springer, Dordrecht, Netherlands, 59, https://doi.org/10.1007/978-1-4020-9693-8 4, 2010.
- Soja, A.J., Cofer, W.R., Shugart, H.H., Sukhinin, A.I., Stackhouse, P.W., McRae, D.J. and Conard, S.G.: Estimating fire
- emissions and disparities in boreal Siberia (1998–2002), J Geophys Res Atmos, 109, https://doi.org/10.1029/2004JD004570,
- 1300 2004a.
- 1301 Soja, A. J., Sukhinin, A.I., Cahoon Jr., D.R., Shugart, H.H., and Stackhouse Jr, P.W.: AVHRR-derived fire frequency,
- distribution and area burned in Siberia, Int. Journal of Remote Sens., 25, 1939, https://doi:10.1080/01431160310001609725,
- 1303 2004b.
- Sokolik, I. N., Soja, A. J., DeMott, P. J., and Winker, D.: Progress and Challenges in Quantifying Wildfire Smoke Emissions,
- 1305 Their Properties, Transport, and Atmospheric Impacts, J. Geophys. Res. Atmos., 124, 13005,
- 1306 https://doi.org/10.1029/2018JD029878, 2019.
- Sommers, W.T., Loehman, R.A. and Hardy, C.C.: Wildland fire emissions, carbon, and climate: Science overview and
- 1308 knowledge needs, For. Ecol. Manage, 317, 1, https://doi.org/10.1016/j.foreco.2013.12.014, 2014.
- 1309 Stralberg, D., Wang, X., Parisien, M.A., Robinne, F.N., Sólymos, P., Mahon, C.L., Nielsen, S.E., and Bayne, E.M.: Wildfire-
- mediated vegetation change in boreal forests of Alberta, Canada. Ecosphere, 9, e02156, https://doi.org/10.1002/ecs2.2156,
- 1311 2018.





- 1312 Stone, R.: As the Arctic thaws, Indigenous Alaskans demand a voice in climate change research, Science Magazine, available
- 1313 at: https://www.sciencemag.org/news/2020/09/arctic-thaws-indigenous-alaskans-demand-voice-climate-change-research#,
- 1314 https://doi.org/10.1126/science.abe7149, 2020.
- 1315 Tchebakova, N.M., Parfenova, E. and Soja, A.J.: The effects of climate, permafrost and fire on vegetation change in Siberia
- in a changing climate, Environ. Res. Lett., 4, 045013, https://doi.org/10.1088/1748-9326/4/4/045013, 2009.
- 1317 Tchebakova, N.M., Rehfeldt, G.E., and Parfenova, E.: From Vegetation Zones to Climatypes: Effects of Climate Warming on
- 1318 Siberian Ecosystems, in: Permafrost Ecosystems, Ecological Studies (Analysis and Synthesis), edited by Osawa, A.,
- 1319 Zyryanova, O., Matsuura, Y., Kajimoto, T., and Wein, R., Springer, Dordrecht, Germany, 427-446,
- 1320 https://doi.org/10.1007/978-1-4020-9693-8_22, 2010.
- Tchebakova, N.M., Parfenova, E.I., Lysanova, G.I., and Soja, A.J.: Agroclimatic potential across central Siberia in an altered
- twenty-first century, Environ. Res. Lett., 6, 045207, https://doi.org/10.1088/1748-9326/6/4/045207, 2011.
- 1323 Tchebakova, N. M., Chuprova, V. V., Parfenova, E. I., Soja, A. J., and Lysanova, G. I.: Evaluating the agroclimatic potential
- of Central Siberia. In: Novel Methods for Monitoring and Managing Land and Water Resources in Siberia, edited by: Mueller
- 1325 L., Sheudshen A., and Eulenstein F. Springer, Cham, https://doi.org/10.1007/978-3-319-24409-9 10, 2016.
- 1326 Terrier, A., Girardin, M. P., Périé, C., Legendre, P., and Bergeron, Y.: Potential changes in forest composition could reduce
- impacts of climate change on boreal wildfires, Ecol Appl, 23, 21, https://doi.org/10.1890/12-0425.1, 2013.
- 1328 Teufel, B., and Sushama, L.: Abrupt changes across the Arctic permafrost region endanger northern development, Nat. Clim.
- 1329 Chang., 9, 858, https://doi.org/10.1038/s41558-019-0614-6, 2019.
- Theesfeld, I., and Jelinek, L.: A misfit in policy to protect Russia's black soil region. An institutional analytical lens applied
- to the ban on burning of crop residues. Land use policy, 67, 517, https://doi.org/10.1016/j.landusepol.2017.06.018, 2017.
- Thomas, J.L., Polashenski, C.M., Soja, A.J., Marelle, L., Casey, K.A., Choi, H.D., Raut, J.C., Wiedinmyer, C., Emmons, L.K.,
- Fast, J.D. and Pelon, J.: Quantifying black carbon deposition over the Greenland ice sheet from forest fires in Canada, Geophys.
- Res. Lett., 44, 7965, https://doi.org/10.1002/2017gl073701, 2017.
- 1335 Thompson, D. K. and Morrison, K.: A classification scheme to determine wildfires from the satellite record in the cool
- grasslands of southern Canada: considerations for fire occurrence modelling and warning criteria, Nat. Hazards Earth Syst.
- 1337 Sci., 20, 3439–3454, https://doi.org/10.5194/nhess-20-3439-2020, 2020.





- 1338 Thompson, D. K., Simpson, B. N., Whitman, E., Barber, Q. E., and Parisien, M. A.: Peatland hydrological dynamics as a driver
- of landscape connectivity and fire activity in the boreal plain of Canada, Forests, 10, 534, https://doi.org/10.3390/f10070534,
- 1340 2019.
- 1341 Tymstra, C., Stocks, B. J., Cai, X., and Flannigan, M. D.: Wildfire management in Canada: Review, challenges and
- opportunities. Progress in Disaster Science, 5, 100045, https://doi.org/10.1016/j.pdisas.2019.100045, 2020.
- 1343 Val Martin, M., Kahn, R. A., and Tosca, M. G.: A Global Analysis of Wildfire Smoke Injection Heights Derived from Space-
- 1344 Based Multi-Angle Imaging, Remote Sens., 10, 1609, https://doi.org/10.3390/rs10101609, 2018.
- van der Werf, G. R., Randerson, J. T., Giglio, L., Collatz, G. J., Kasibhatla, P. S., and Arellano Jr., A. F.: Interannual variability
- in global biomass burning emissions from 1997 to 2004, Atmos. Chem. Phys., 6, 3423–3441, https://doi.org/10.5194/acp-6-
- 1347 3423-2006, 2006.
- van der Werf, G. R., Randerson, J. T., Giglio, L., Collatz, G. J., Mu, M., Kasibhatla, P. S., Morton, D. C., DeFries, R. S., Jin,
- 1349 Y., and van Leeuwen, T. T.: Global fire emissions and the contribution of deforestation, savanna, forest, agricultural, and peat
- 1350 fires (1997–2009), Atmos. Chem. Phys., 10, 11707–11735, https://doi.org/10.5194/acp-10-11707-2010, 2010.
- van der Werf, G. R., Randerson, J. T., Giglio, L., van Leeuwen, T. T., Chen, Y., Rogers, B. M., Mu, M., van Marle, M. J. E.,
- Morton, D. C., Collatz, G. J., Yokelson, R. J., and Kasibhatla, P. S.: Global fire emissions estimates during 1997–2016, Earth
- 1353 Syst. Sci. Data, 9, 697–720, https://doi.org/10.5194/essd-9-697-2017, 2017.
- van Leeuwen, T. T., van der Werf, G. R., Hoffmann, A. A., Detmers, R. G., Rücker, G., French, N. H. F., Archibald, S.,
- 1355 Carvalho Jr., J. A., Cook, G. D., de Groot, W. J., Hély, C., Kasischke, E. S., Kloster, S., McCarty, J. L., Pettinari, M. L.,
- Savadogo, P., Alvarado, E. C., Boschetti, L., Manuri, S., Meyer, C. P., Siegert, F., Trollope, L. A., and Trollope, W. S. W.:
- 1357 Biomass burning fuel consumption rates: a field measurement database, Biogeosciences, 11, 7305-7329,
- 1358 https://doi.org/10.5194/bg-11-7305-2014, 2014.
- 1359 Veira, A., Lasslop, G., and Kloster, S.: Wildfires in a warmer climate: emission fluxes, emission heights, and black carbon
- concentrations in 2090–2099, J. Geophys. Res. Atmos., 121, 3195, https://doi.org/10.1002/2015jd024142, 2016.
- Venäläinen, A., Lehtonen, I., Laapas, M., Ruosteenoja, K., Tikkanen, O.P., Viiri, H., Ikonen, V.P. and Peltola, H.: Climate
- change induces multiple risks to boreal forests and forestry in Finland: A literature review, Glob Chang Biol., 26, 4178,
- 1363 https://doi.org/10.1111/gcb.15183, 2020.





- 1364 Veraverbeke, S., Rogers, B. M., Goulden, M. L., Jandt, R. R., Miller, C. E., Wiggins, E. B., and Randerson, J. T.: Lightning
- as a major driver of recent large fire years in North American boreal forests, Nature Clim Change, 7, 529,
- 1366 https://doi.org/10.1038/nclimate3329, 2017.
- Waigl, C. F., Stuefer, M., Prakash, A., and Ichoku, C.: Detecting high and low-intensity fires in Alaska using VIIRS I-band
- 1368 data: An improved operational approach for high latitudes, Remote Sens. Environ, 199, 389,
- 1369 https://doi.org/10.1016/j.rse.2017.07.003, 2017.
- Waigl, C. F., Prakash, A., Stuefer, M., Verbyla, D., and Dennison, P.: Fire detection and temperature retrieval using EO-1
- Hyperion data over selected Alaskan boreal forest fires, Int J Appl Earth Obs, 81, 72, https://doi.org/10.1016/j.jag.2019.03.004,
- 1372 2019.
- Walker, X.J., Rogers, B.M., Baltzer, J.L., Cumming, S.G., Day, N.J., Goetz, S.J., Johnstone, J.F., Schuur, E.A., Turetsky, M.R.
- and Mack, M.C.: Cross-scale controls on carbon emissions from boreal forest megafires, Glob Chang Biol., 24,
- 1375 4251,https://doi.org/10.1111/gcb.14287, 2018.
- Walker, X.J., Baltzer, J.L., Cumming, S.G., Day, N.J., Ebert, C., Goetz, S., Johnstone, J.F., Potter, S., Rogers, B.M., Schuur,
- 1377 E.A. and Turetsky, M.R.: Increasing wildfires threaten historic carbon sink of boreal forest soils, Nature, 572, 520,
- 1378 https://doi.org/10.1038/s41586-019-1474-y, 2019.
- Walker, X.J., Rogers, B.M., Veraverbeke, S., Johnstone, J.F., Baltzer, J.L., Barrett, K., Bourgeau-Chavez, L., Day, N.J., de
- 1380 Groot, W.J., Dieleman, C.M. and Goetz, S.:Fuel availability not fire weather controls boreal wildfire severity and carbon
- emissions, Nat. Clim. Chang., 10, 1130, https://doi.org/10.1038/s41558-020-00920-8, 2020.
- Walsh, J.E., Ballinger, T.J., Euskirchen, E.S., Hanna, E., Mård, J., Overland, J.E., Tangen, H. and Vihma, T.: Extreme weather
- and climate events in northern areas: A review. Earth-Sci. Rev., 209, 103324, https://doi.org/10.1016/j.earscirev.2020.103324,
- 1384 2020.
- Wang, X., Parisien, M.A., Taylor, S.W., Candau, J.N., Stralberg, D., Marshall, G.A., Little, J.M. and Flannigan, M.D.:
- 1386 Projected changes in daily fire spread across Canada over the next century, Environ. Res. Lett., 12, 025005,
- 1387 https://doi.org/10.1088/1748-9326/aa5835, 2017.
- Wang, J. A., Sulla-Menashe, D., Woodcock, C. E., Sonnentag, O., Keeling, R. F., and Friedl, M. A.: Extensive land cover
- 1389 change across Arctic-Boreal Northwestern North America from disturbance and climate forcing, Glob Chang Biol., 26, 807,
- 1390 https://doi.org/10.1111/gcb.14804, 2019.





- Watson, J. G., Cao, J., Chen, L.-W. A., Wang, Q., Tian, J., Wang, X., Gronstal, S., Ho, S. S. H., Watts, A. C., and Chow, J.
- 1392 C.: Gaseous, PM2.5 mass, and speciated emission factors from laboratory chamber peat combustion, Atmos. Chem. Phys., 19,
- 1393 14173–14193, https://doi.org/10.5194/acp-19-14173-2019, 2019.
- Wein, R. W.: Frequency and characteristics of arctic tundra fires, Arctic, 29, 213, https://doi.org/10.14430/arctic2806, 1978.
- Whitman, E., Parisien, M. A., Thompson, D. K., and Flannigan, M. D.: Short-interval wildfire and drought overwhelm boreal
- forest resilience, Sci Rep, 9, 18796, https://doi.org/10.1038/s41598-019-55036-7, 2019.
- Wiedinmyer, C., Akagi, S. K., Yokelson, R. J., Emmons, L. K., Al-Saadi, J. A., Orlando, J. J., and Soja, A. J.: The Fire
- 1398 INventory from NCAR (FINN): a high resolution global model to estimate the emissions from open burning, Geosci. Model
- 1399 Dev., 4, 625–641, https://doi.org/10.5194/gmd-4-625-2011, 2011.
- Wilkinson, S. L., Moore, P. A., Thompson, D. K., Wotton, B. M., Hvenegaard, S., Schroeder, D., and Waddington, J. M.: The
- effects of black spruce fuel management on surface fuel condition and peat burn severity in an experimental fire, Can. J. For.
- 1402 Res., 48, 1433, https://doi.org/10.1139/cjfr-2018-0217, 2018.
- Wilkinson, S. L., Moore, P. A., and Waddington, J. M.: Assessing Drivers of Cross-Scale Variability in Peat Smoldering
- 1404 Combustion Vulnerability in Forested Boreal Peatlands. Front. For. Glob. Change, 2, 84,
- 1405 https://doi.org/10.3389/ffgc.2019.00084, 2019.
- Wilson, G. N.: Indigenous Internationalism in the Arctic, in: The Palgrave Handbook of Arctic Policy and Politics, edited by:
- 1407 Coates, K.S., and Holroyd, C., Palgrave Macmillan, Cham, Switzerland, 27-40, https://doi.org/10.1007/978-3-030-20557-7_3,
- 1408 2020.
- 1409 Witze, A.: The Arctic is burning like never before-and that's bad news for climate change. Nature, 585, 336,
- 1410 https://doi.org/10.1038/d41586-020-02568-y, 2020.
- Wotton, B. M., Martell, D. L., and Logan, K. A.: Climate change and people-caused forest fire occurrence in Ontario, Clim.
- 1412 Change, 60, 275, https://doi.org/10.1023/A:1026075919710, 2003.
- 1413 Wotton, B. M., Flannigan, M. D., and Marshall, G. A.: Potential climate change impacts on fire intensity and key wildfire
- suppression thresholds in Canada, Environ. Res. Lett., 12, 095003, https://doi.org/10.1088/1748-9326/aa7e6e, 2017.
- 1415 Xu, J., Morris, P. J., Liu, J., and Holden, J.: PEATMAP: Refining estimates of global peatland distribution based on a meta-
- analysis, Catena, 160, 134, https://doi.org/10.1016/j.catena.2017.09.010, 2018.





- 1417 Xu, W., He, H. S., Hawbaker, T. J., Zhu, Z., and Henne, P. D.: Estimating burn severity and carbon emissions from a historic
- megafire in boreal forests of China, Sci Total Environ, 136534, https://doi.org/10.1016/j.scitotenv.2020.136534, 2020.
- 1419 Yanagiya, K., and Furuya, M.: Post-wildfire surface deformation near Batagay, Eastern Siberia, detected by L-band and C-
- band InSAR, J. Geophys. Res, 125, e2019JF005473, https://doi.org/10.1029/2019JF005473, 2020.
- 1421 York, A., Bhatt, U.S., Gargulinski, E., Garbinski, Z., Jain, P., Soja, A., Thoman, R.L., and Ziel, R: Wildland Fire in High
- Northern Latitudes, in: Arctic Report Card 2020, edited by: Thoman, R.L., Richter-Menge, J., and Druckenmiller, M.L.,
- available at: https://arctic.noaa.gov/Report-Card/Report-Card-2020/ArtMID/7975/ArticleID/903/Wildland-Fire-in-High-
- Northern-Latitudes, https://doi.org/10.25923/2gef-3964, 2020.
- 1425 Young, A. M., Higuera, P. E., Duffy, P. A., and Hu, F. S.: Climatic thresholds shape northern high-latitude fire regimes and
- imply vulnerability to future climate change, Ecogeg, 40, 606, https://doi.org/10.1111/ecog.02205, 2016.
- Young, T. K., and Bjerregaard, P.: Towards estimating the indigenous population in circumpolar regions. Int. J. Circumpolar
- 1428 Health, 78, 1653749, https://doi.org/10.1080/22423982.2019.1653749, 2019.
- Yu, P., Toon, O.B., Bardeen, C.G., Zhu, Y., Rosenlof, K.H., Portmann, R.W., Thornberry, T.D., Gao, R.S., Davis, S.M., Wolf,
- 1430 E.T. and de Gouw, J.: Black carbon lofts wildfire smoke high into the stratosphere to form a persistent plume, Science, 365,
- 1431 587, https://doi.org/10.1126/science.aax1748, 2019.
- 1432 Yu, Z., Loisel, J., Brosseau, D. P., Beilman, D. W., and Hunt, S. J.: Global peatland dynamics since the Last Glacial Maximum,
- 1433 Geophys. Res. Lett., 37, https://doi.org/10.1029/2010g1043584, 2010.
- 1434 Zhang, R., Huang, C., Zhan, X., Jin, H., and Song, X. P.: Development of S-NPP VIIRS global surface type classification map
- using support vector machines, Int. J. Digit. Earth, 11, 212, https://doi.org/10.1080/17538947.2017.1315462, 2018.
- 1436 Zhu, C., Kobayashi, H., Kanaya, Y., & Saito, M. (2017). Size-dependent validation of MODIS MCD64A1 burned area over
- six vegetation types in boreal Eurasia: Large underestimation in croplands, Sci Rep, 7, 4181, https://doi.org/10.1038/s41598-
- 1438 017-03739-0, 2017.
- 21439 Zielinski, T., Bolzacchini, E., Cataldi, M., Ferrero, L., Graßl, S., Hansen, G., Mateos, D., Mazzola, M., Neuber, R., Pakszys,
- 1440 P. and Posyniak, M., 2020. Study of Chemical and Optical Properties of Biomass Burning Aerosols during Long-Range
- 1441 Transport Events toward the Arctic in Summer 2017, Atmosphere, 11, 84, https://doi.org/10.3390/atmos11010084, 2020.



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Tables and Figures

Table 1: Policy driven questions tasked to be answered by the SLCF EG of AMAP, a Working Group of the Arctic Council, for the AMAP Assessment 2021: Arctic climate, air quality, and health impacts from short-lived climate forcers (SLCFs).

- What are the impacts of climate change on fire risk and fire emissions?
- 2. What are current and future fire management strategies in the Arctic?
- What are the long term emissions from open biomass burning? 3.
- What are the emissions from 'natural' fires? 4.
- 5. What are the emissions from human-caused open biomass burning?
- What are the uncertainties in future natural and open biomass burning emissions? 6.

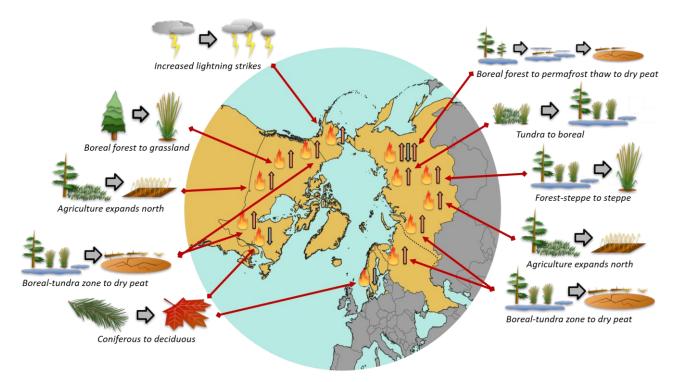


Figure 1: A sample of peer-reviewed future Arctic fire risk variables due to expected ecological and meteorological transitions by mid- and late 21st century climate change for Arctic Council member states. 'Up arrows' indicate increase in fire risk and 'down arrows' indicate a decrease in fire risk, with the location of the arrows approximate to the location of fire risk from the literature and not projections for a given country; the dashed line indicates the boundary between European Russia, and Siberia and the Russian Far East.

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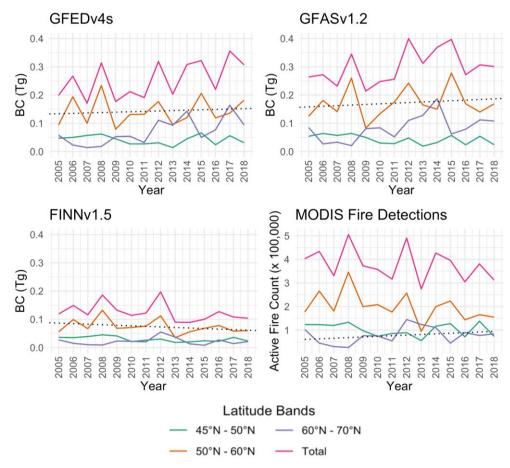


Figure 2: Annual black carbon (BC) emissions in Tg from three commonly used global fire emissions models and annual fire activity from the MODIS Collection 6 active fire product (Terra and Aqua) split by latitude ranges for the Arctic Council Region, 2005 - 2018; note the y-axis has been standardized for each model for ease of comparison; dotted line is the positive trend for BC emissions from open biomass burning and 1 km MODIS active fire detections (Terra and Aqua) for 60° to 70° N.





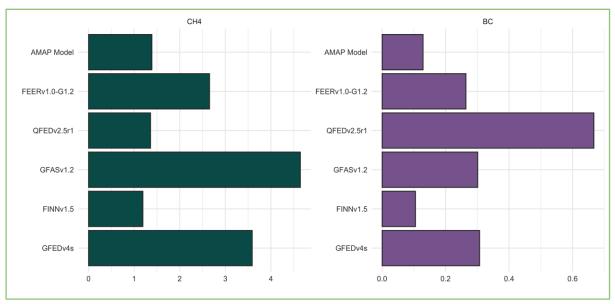


Figure 3: Annual 2018 BC and CH4 emissions in Tg from five global fire emissions models and a custom AMAP fire emissions model for north of 45°N.

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Table 2: Summary table of BC, PM2.5, and CH4 emissions in teragrams (Tg) from reported statistics on burned area from the Arctic Council members; sources for burned area include Norway (DSB, 2020), Greenland (Markuse, 2019), Finland (Ketola, 2020), Sweden (Betänkande av 2018 års skogsbrandsutredning, 2019), Canada (CIFFC, 2020), Alaska (Alaska Division of Forestry, 2020), the contiguous United States (NIFC, 2019), and the Russian Federation (ФБУ "АВИАЛЕСООХРАНА", 2019); fuel loadings and combustion completeness from Van Leeuwen et al. (2014) for boreal forests, with tundra values used for Greenland and temperate forests for the USA/CONUS; emission factors taken from GFED4.

Country/		Official			
Region	Year	Burned Area (km ²)	BC (Tg)	PM _{2.5} (Tg)	CH ₄ (Tg)
Norway	2019	0.03	7.61E-12	2.33E-10	9.08E-11
Denmark/ Greenland	2019	8	1.27E-10	2.88E-08	6.59E-08
	2010		2 007 00	5 007 00	2 007 00
Finland	2019	6	2.00E-09	5.00E-08	2.00E-08
Sweden	2018	250	6.30E-08	1.94E-06	7.60E-07
Canada	2019	18,389	4.67E-06	1.43E-04	5.56E-05
USA/ Alaska	2019	10,481	2.66E-06	8.14E-05	3.17E-05





USA/ CONUS	2019	18,876	1.02E-05	3.43E-04	9.64E-05
Russia	2019	100,785	2.56E-05	7.83E-04	3.05E-04
	•				
Total		148,795	4.30E-05	1.35E-03	4.90E-04

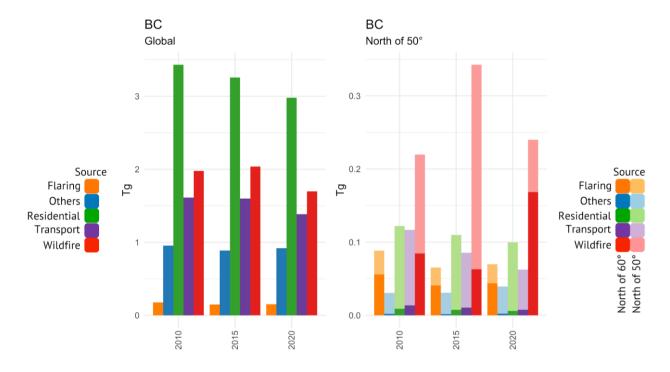


Figure 4: Annual black carbon emissions for 2010, 2015, and 2020 from four anthropogenic source sectors (residential, transport, flaring, others) from GAINS and wildfires from GFAS, presented globally (left) and (right) 50° - 60° N (lighter colours of the cumulative bar) and north of 60° N latitude (darker colours of the cumulative bar).



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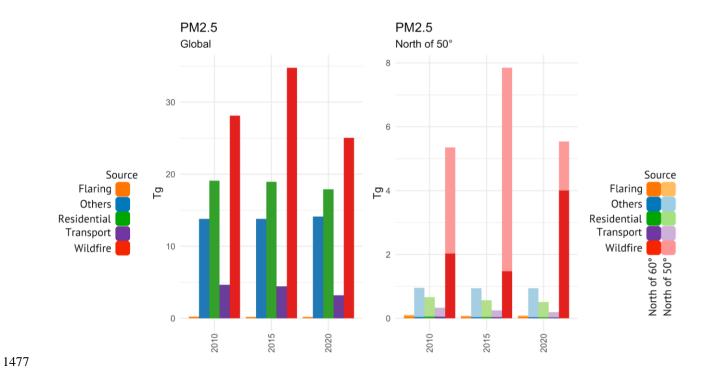


Figure 5: Annual PM_{2.5} emissions for 2010, 2015, and 2020 from four anthropogenic source sectors (residential, transport, flaring, others) from GAINS and wildfires from GFAS, presented globally (left) and (right) 50° - 60° N (lighter colours of the cumulative bar) and north of 60° N latitude (darker colours of the cumulative bar).



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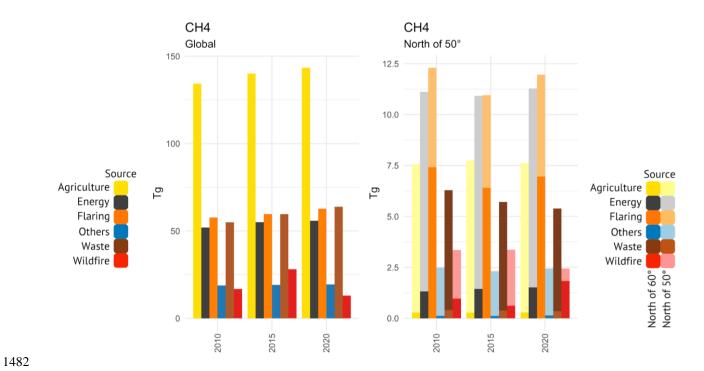


Figure 6: Annual CH₄ emissions for 2010, 2015, and 2020 from four anthropogenic source sectors (residential, transport, flaring, others) from GAINS and wildfires from GFAS, presented globally (left) and (right) 50° - 60° N (lighter colours of the cumulative bar) and north of 60° N latitude (darker colours of the cumulative bar).



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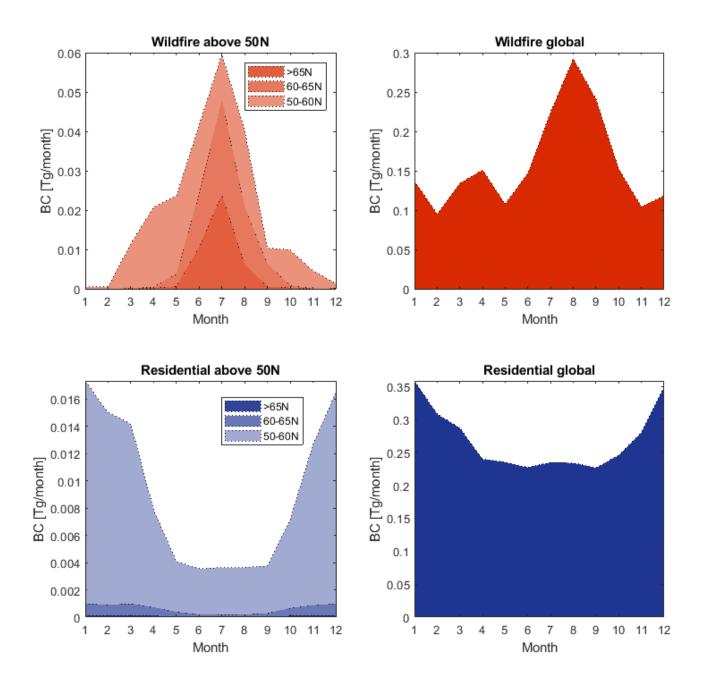


Figure 7: Monthly black carbon emissions from the leading anthropogenic sector, residential heating, in GAINS and wildfires from GFAS by latitudinal ranges (left) and global (right); emissions are averaged from the given years of 2010, 2015 and 2020 to align with the GAINS data availability.





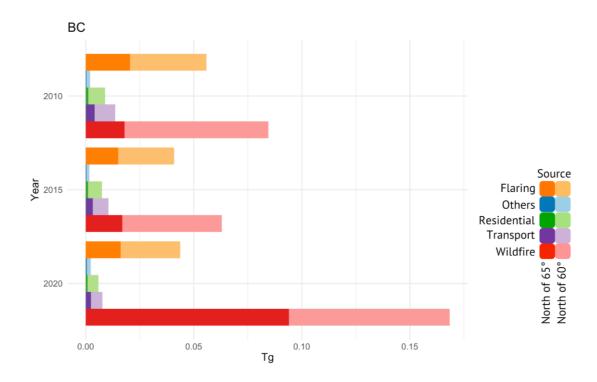


Figure 8: Sectoral black carbon emissions above 60° N (lighter colours) and 65° N (darker colours) for 2010, 2015, and 2020; anthropogenic emissions from GAINS and wildfire emissions from GFAS.

Code and Data Availability

The GFEDv4s, FINNv1.5, GFASv1.2, QFEDv2.5r1, FEERv1.0-G1.2 fire emissions data for 2005 through 2018 were downloaded from https://globalfires.earthengine.app/view/firecam. The AMAP SLCF EG 2018 Pan-Arctic fire emissions database can be downloaded at https://zenodo.org/record/4648723#.YGTq469KhPY (embargoed access until review is complete, can be provided to editors to share with reviewers) and R code used to compute it can be downloaded at https://github.com/fainij. 2020 global GFAS emissions data was downloaded from: https://github.com/fainij. 2020 global emission data can be accessed at <a href="https://iiasa.ac.at/web/home/research/researc

Supplement

The supplement related to this article is available online at:



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Author Contributions JLM coordinated the review, designed the fire emission models comparison, co-led the creation of the custom AMAP fire emissions model with JJF, archived the literature for the review, and wrote the manuscript. JA, SE, AV, SRA, NE, and KK provided major efforts in manuscript design and organization. VVP, JJF, ZK, and JLM led the GAINS and GFAS analysis. JJF, VVP, SE, and JLM created the figures and supplemental materials, with input from the remaining authors. All authors contributed to interpretation and verification of the review, as well as contributing to the writing of the manuscript. **Competing Interests** The authors declare that they have no conflict of interest. **Special Issue Statement** This article is part of the special issue "Arctic climate, air quality, and health impacts from short-lived climate forcers (SLCFs): contributions from the AMAP Expert Group". Acknowledgements This paper was developed as part of the Arctic Monitoring Assessment Programme (AMAP), AMAP 2021 Assessment: Arctic climate, air quality, and health impacts from short-lived climate forcers (SLCFs). The authors would like to thank the Arctic Monitoring and Assessment Programme Secretariat for providing additional input and review. C.J. Mescher is acknowledged for his contributions in designing and creating original scientific artwork in this manuscript. **Financial support** This research has been supported by: JLM and JJF acknowledge internal research support from Miami University; JA and AV acknowledges funding from the Ministry for Foreign Affairs of Finland (IBA Forest Fires, decision PC0TQ4BT-53); VVP acknowledges support from Business Finland (BC Footprint; grant no. 1462/31/2019); SRA acknowledges support from the ACRoBEAR project, funded by the Belmont Forum Climate, Environment and Health (CEH) Collaborative Research Action and the UK Natural Environment Research Council (grant no. NE/T013672/1), and support from the Arctic Monitoring and

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