

Global wildfire patterns and drivers under climate change

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Abstract

Wildfires increasingly threaten human lives, ecosystems, and climate, yet a comprehensive understanding of the factors driving their future dynamics and emissions remains elusive, hampering mitigation efforts. In this study, we assessed how future climate change would influence global burned area (BA) and carbon emissions between 2015 to 2100 using the Community Land Model version 5 (CLM5) with active biogeochemistry and fires. The model reasonably captures observed spatial and seasonal patterns of BA and emissions during the present-day reference period. Under two future scenarios – SSP1-2.6 (low warming) and SSP3-7.0 (high warming) – CLM5 projects global BA increases of $+6400 \text{ km}^2 \text{ yr}^{-1}$ and $+7500 \text{ km}^2 \text{ yr}^{-1}$, respectively. Northern extratropics, particularly the boreal regions, emerge as the dominant hotspot with BA increasing by 200% and fire-related carbon emissions by $+4$ to $+7 \text{ Tg yr}^{-1}$, while in tropical regions BA remains comparatively stable or slightly declines. These shifts are associated with warming-induced changes in vegetation productivity and fuel dryness, particularly in boreal ecosystems. Enhanced vegetation carbon contributes to fuel availability, while declines in relative humidity and soil moisture increase flammability. Elevated atmospheric CO_2 also contributes to these effects by enhancing biomass growth through fertilization and increasing water use efficiency, thereby affecting fire risks and carbon emissions. These findings underscore the need to integrate climate-vegetation-fire interactions into global policy frameworks for effective mitigation and adaptation planning of future fire-related threats.

Keywords:

Wildfires, Burned Area (BA), Carbon Emissions, Climate Change, Community Land Model (CLM5)

1. Introduction

Wildfires, known for their unplanned and rapid spread, have profound and wide-ranging impacts, from threatening human welfare and infrastructure to altering ecosystems and contributing to global climate dynamics ([Li et al., 2017](#); [Bowman et al., 2020](#)). These events cause devastation through combustion and release of vast amounts of chemically and radiatively active gases and aerosols into the atmosphere ([Andreae and Merlet, 2001](#); [Bowman et al., 2009](#); [Coen et al., 2013](#); [Liu et al., 2019](#); [Tang et al., 2022](#); [Zhang et al., 2022](#); [Bhattarai et al., 2024](#)). Annually, wildfires consume millions of square kilometers of land, shaping natural forest successions while disrupting ecological equilibria ([Wright and Heinzelman, 2014](#)). Recent estimates on Global Fire Emissions Database version five (GFED5) shows a declining trend ($1.21\% \text{ yr}^{-1}$) of global annual burned area (BA) from 2001 to 2020, with a 20-year average BA of $7.74 \text{ million km}^2 \text{ yr}^{-1}$, which is around 5.9% of ice free land ([Chen et al., 2023](#)). Such decline is primarily driven by reduced BA in savannas, mainly due to agricultural expansion and intensification ([Andela et al., 2017](#)). However, BA trends largely vary with region, where the boreal region experiences an increasing trend ($2.5\% \text{ yr}^{-1}$), while most other regions show reductions by up to $2.7\% \text{ yr}^{-1}$. BA declines over vast grasslands but increases in small forested areas, resulting in a sharp overall reduction in BA, while carbon emissions remain nearly stable, as forests emit more carbon per unit area than grasslands, offsetting the decline in emissions ([Zheng et al., 2021](#)). Long-term analysis indicates that climate change may exacerbate BA trends, substantially increasing carbon emissions from the biosphere and amplifying disruptions to the global carbon cycle ([Van Der Werf et al., 2010](#); [Burton et al., 2024b](#); [Jones et al., 2024](#)).

The socioeconomic impacts of wildfires are also substantial ([Kochi et al., 2010](#); [Tymstra et al., 2020](#)). For instance, the 2019/2020 Australian wildfires resulted in nearly \$100 billion of economic losses including firefighting costs and damage to infrastructure, business, and wildlife ([Roach, 2020](#)). Similar devastating events in Canada peaked in 2023 due to a combination of hot, dry weather conditions and human activities, including vehicle accidents, recreational uses of forests, and land management practices, causing accidental ignitions ([Owens, 2023](#); [Byrne et al., 2024](#)). Lightning is the major igniting source of wildfires in Canada, contributing to 85% of the total burned area every year. Additionally, unprecedented wildfires have ravaged the western US ([Higuera and Abatzoglou, 2021](#)), Siberia ([Bondur et al., 2020](#)),

and the Himalayas ([Bhattarai et al., 2023](#)), often exacerbated by climate change-associated weather anomalies ([Jones et al., 2022](#)).

Wildfire dynamics is governed by the complex interplay of natural and human factors. Meteorological variables, such as temperature, soil moisture, precipitation, wind, and relative humidity (RH) significantly influence fuel availability and combustibility ([Aldersley et al., 2011](#); [Kloster et al., 2012](#); [Hantson et al., 2015](#); [Knorr et al., 2016](#); [Jones et al., 2022](#); [Senande-Rivera et al., 2022](#); [Shi and Touge, 2022](#)). Higher temperatures and stronger winds increase wildfire risks, while precipitation and soil moisture mitigate fire spread. Vegetation dynamics also play a critical role, as elevated precipitation and CO₂ levels enhance vegetation growth, which in turn can potentially increase the availability of combustible materials ([Allen et al., 2024](#)). In addition, anthropogenic land use changes, including deforestation and agricultural expansion, have transformed landscapes in ways that either amplify or suppress wildfire risks. For example, agricultural expansion in South America has reduced BA in some regions ([Aldersley et al., 2011](#); [Zubkova et al., 2023](#)). These factors collectively drive the spatiotemporal variability of wildfires.

Climate change is a dominant driver of increasing wildfire risks, with rising global temperatures and more frequent El Nino-Southern Oscillation (ENSO) events leading to regional temperature extremes and prolonged dry periods ([Fuller and Murphy, 2006](#); [Fasullo et al., 2018](#)). These conditions exacerbate wildfire frequency and intensity, particularly in boreal and tropical forests ([IPCC, 2014](#); [Fasullo et al., 2018](#)). For instance, Canadian fire season has extended by around two weeks, starting a week earlier and ending a week later compared to its pattern 50 years before ([Owens, 2023](#)). Future projections indicate heightened wildfire risks due to climate-induced shifts in meteorological conditions, such as snow melt timing and extended droughts ([Flannigan et al., 2009](#); [Liu et al., 2010](#); [Veira et al., 2016](#); [Di Virgilio et al., 2019](#); [Li et al., 2020](#); [Jones et al., 2022](#)). However, the interplay of socioeconomic factors, including population density and gross domestic product (GDP), may mitigate these risks through improved fire suppression and management measures ([Kloster et al., 2012](#); [Val Martin et al., 2015](#); [Veira et al., 2016](#)). Studies based on Representative Concentration Pathways (RCPs) suggest that while climate change amplifies fire risks, human intervention could counterbalance these effects to some extent ([Dong et al., 2022](#); [Nurrohman et al., 2024](#)).

Despite these advancements, significant knowledge gaps remain in understanding the divergent fire dynamics over tropics and boreal regions, their seasonal variability, and the roles of

vegetation and hydrological changes under future climate conditions. While several studies have projected future wildfire trends and carbon emissions using various climate scenarios (e.g., [Scholze et al., 2006](#); [Knorr et al., 2016](#); [Kloster and Lasslop, 2017](#); [Wu et al., 2022](#)), research specifically addressing the effects of recently developed low and high warming climate pathways on BA and wildfire emissions remains limited. Existing studies have primarily focused on fire weather indices ([Quilcaille et al., 2023](#)) or specific mitigation strategies such as solar geoengineering ([Tang et al., 2023](#)), leaving the broader influence of climate change on global wildfire patterns, independent of direct socioeconomic drivers, less explored. Investigating future fire dynamics using the latest climate-fire-enabled global terrestrial system model, combined with state-of-the-art climate projections, is essential to improve predictions of wildfire frequency and intensity and their cascading effects on air quality, carbon cycling, and climate feedback.

In this study, we examined how future climate change would impact global wildfires throughout the 21st century, focusing on SSP1-2.6 (low-warming) and SSP3-7.0 (high-warming) (hereafter referred to as SSP1 and SSP3). Using the climate projections from the Community Earth System Model (CESM) database, we analyzed trends in BA and emissions of key carbonaceous species to provide new insights into the spatial distribution and intensity of future wildfire events. By focusing on SSP1/SSP3 climate-driven changes while holding socioeconomic drivers (land use and populations) constant, our study isolates the effects of warming on fire dynamics, offering a clearer understanding of how different climate pathways shape future wildfire risks. This research highlights the potential implications for carbon emissions and informs strategies to mitigate the impacts of future wildfires in a changing climate.

2. Methods

2.1 Community Land Model (CLM)

In this study, we used the Community Land Model version 5 (CLM5), the land component within the Community Earth System Model (CESM) ([Lawrence et al., 2019](#); [Danabasoglu et al., 2020](#)). CLM5 was run with active biogeochemistry and an interactive fire module ([Li et al., 2013](#)) to investigate the implications of climate change on wildfires and their resulting effects on BA and emissions of carbonaceous species. This configuration enables vegetation to respond dynamically to changes in climate conditions and elevated CO₂ levels within its carbon and nitrogen cycles. CLM5 operates at the plant functional type (PFT) level, simulating

interactions among each PFT, soil organic matter, and atmosphere, thereby capturing the impacts of climate change and fires on terrestrial ecosystems. While CLM5 simulates vegetation structure, carbon allocation, and biomass dynamics in response to environmental drivers, it does not include dynamic changes in PFT composition, competition, or succession as in Dynamic Global Vegetation Models. This constraint may limit the representation of biome shifts and their long-term feedbacks on fire regimes. Thus, vegetation types remain fixed in space, although their biomass and productivity evolve, which is important for fire regime responses driven by vegetation.

We conducted model simulations at a horizontal grid resolution of $0.9^{\circ} \times 1.25^{\circ}$ (latitude $\times$ longitude). Within each grid cell, subgrid cells defining various land cover types in CLM5 are represented, including urban, glacier, and vegetated areas. Vegetated land is further characterized by 16 distinct PFTs, encompassing diverse vegetation ranging from forest to grasslands and crops, and including bare land.

2.2 Fire module in CLM5

The CLM5 fire module has been rigorously validated through comparisons with fire emission inventories and satellite observations, and has been widely adopted in prior research ([Li et al., 2012](#); [Li et al., 2013](#); [Li et al., 2017](#); [Ford et al., 2018](#); [Li et al., 2019](#); [Tang et al., 2023](#)). The CLM5 fire module represents an advancement in understanding the interplay among fire dynamics, vegetation, and the Earth's climate system ([Li et al., 2013](#)). Built on a process-based fire parameterization, the CLM5 fire module accounts for four distinct fire types: (i) agricultural fires in croplands, (ii) deforestation fires in tropical closed forests, (iii) peat fires, and (iv) non-peat fires occurring beyond croplands and tropical closed forests ([Li et al., 2012](#); [Li et al., 2013](#)). Fire ignitions include both natural and anthropogenic sources, with lightning datasets from NASA serving as the basis for natural ignitions, while anthropogenic ignitions are influenced by population density and GDP, whereby higher population and GDP effectively suppress fire occurrences. The module estimates the likelihood of fire occurrence by considering the availability of biomass as fuel, combustibility of the fuel depending on its moisture content, and presence of an ignition source, whether human-induced or from lightning. Thus, BA within the CLM5 fire scheme is driven by socioeconomic activities, vegetation composition, and prevailing weather conditions (e.g., temperature, RH, wind, precipitation, and soil moisture). Upon determination of BA, gas and aerosol emissions from fires are obtained at the grid cell level.

In this study, to focus on the impacts of future climate change on wildfires, land use and populations were held constant at present-day levels, allowing only climate to evolve over time. This introduces a partial decoupling from the SSP framework but allows us to attribute changes in BA and emissions directly to climate-driven factors, independent of socioeconomic and land use shifts. While fixing land use change directly affects fuel availability, fixing population change is associated with fire management (suppress or ignite), thereby affecting BA and carbon emissions. This approach thus fixes natural and anthropogenic ignition sources while permitting fuel availability and combustibility to change along with future climate. Climate change accounts for changes in CO₂ levels and precipitation, temperature, pressure, RH, wind, and radiation. These changes exert direct influences on fuel availability and combustibility, shaped by evolving climate conditions and vegetation characteristics. Although CLM5 tracks four fire types, our analysis focuses on total BA and aggregated emissions. Since land use and populations were held constant in our simulations, the projected increases in BA are primarily attributable to natural vegetation and peat fires, particularly dominant in high-latitude regions. We considered two future climate projections: low warming (SSP1-2.6; hereafter referred to as SSP1) and high warming (SSP3-7.0; hereafter referred to as SSP3). SSP1 projects an increase of atmospheric CO₂ of 70 ppm up to 2050, after which it stabilizes, whereas SSP3 projects a 140 ppm increase by 2050 and 467 ppm by 2100, relative to 2015 levels (400 ppm). Global land temperature rises sharply under SSP3, with an increase of 1.6°C during the 2050s (2050–2059 average) and 3.8°C during the 2090s (2090–2099 average) compared to present-day conditions (2015–2024 average of 10.4°C). In contrast, SSP1 shows a temperature increase of only 1.2°C by 2050, with relatively stable conditions in the later part of the century.

2.3 Model experiments

We first spun up CLM5 with the fire module active to steady state in 1850 using an accelerated decomposition procedure and fixed pre-industrial CO₂, land use, and atmospheric nitrogen (N) deposition ([Lawrence et al., 2019](#)). The accelerated decomposition spin-up was for about 1200 years as the total soil organic matter carbon in the Arctic regions required a longer time frame to reach equilibrium; we considered the model fully spun up when the land surface had more than 97 % of the total ecosystem carbon in equilibrium. The present-day spin-up was based on a historical simulation for 1850–2014 using historical N and aerosol deposition, atmospheric CO₂ forcing, land use change, and meteorological forcings from the Global Soil Wetness Project (GSWP3v1) ([Lawrence et al., 2019](#)).

For future runs, we initialized CLM5 in 2015 with the prescribed climate for the low and high warming scenarios simulated by CESM2 for Coupled Model Intercomparison Project Phase 6 (CMIP6), and conducted transient simulations until 2100. Both SSP1 and SSP3 were forced with outputs from the same CESM ensemble member, meaning that they share internal variability in the early part of the simulation. For the first ten years, both scenarios exhibit very similar behavior in terms of BA (SSP1: 5.18 ± 0.37 million km², SSP3: 5.15 ± 0.39 million km²) and emissions (Figure S1), as climate and CO₂ levels at the start of both scenarios are nearly identical and have not yet diverged. Therefore, we considered the period from 2015 to 2024 for SSP1 as representative of present-day conditions (referred to as ‘Baseline’ and reported average $\pm$ standard deviation, SD). Although these are transient simulations, for certain analyses, we selected results from 2090 to 2099 (referred to as “2090s” and reported average $\pm$ SD) to calculate the differences from the present-day conditions for the respective climate scenario to estimate future changes. To analyze long-term trends, we applied a centered 30-year moving average to the annual values, which was implemented using a symmetric padding method with convolution, ensuring that each smoothed value is centered on the corresponding year. These smoothing highlights decadal variability and long-term trends while minimizing short-term fluctuations. These experiments were aimed to assess the isolated impacts of climate change on wildfires and emissions of air pollutants, while holding anthropogenic land management constant.

2.4 Validation of global burned area and fire emissions

Our model results capture both the spatial distribution and magnitude of global BA and wildfire emissions (Figure 1), demonstrating good agreement with the Global Fire Emission Database (GFED) ([Randerson et al., 2017](#); [Chen et al., 2023](#)). GFED derives estimates of BA and emissions by integrating satellite-derived fire activity data with biogeochemical modeling approaches. We consider both GFED4.1 and GFED5 in this validation as they use different methodologies, with GFED5 accounting for small fires that are often missed by satellite sensors, leading to higher BA estimates compared to GFED4.1 ([Chen et al., 2023](#)).

For the present day (2015–2024), CLM5 simulates a global annual BA of 5.18 ± 0.37 million km² (mean $\pm$ SD), which lies between the estimates of GFED4.1 averaged for the 2007–2016 (4.48 ± 0.36 million km²) and GFED5 averaged for the 2011–2020 (7.31 ± 0.39 million km²). The decadal mean is calculated based on the data available in the last ten years. Our results also align with historical estimates for 2001–2018, ranging from 3.9 to 5.2 million km²

([Lizundia-Loiola et al., 2020](#)). Despite some biases, the model performance is robust, with a normalized mean bias of +15.6% (−29.1%) and a correlation coefficient (R) of 0.64 (0.62) when compared to GFED4.1 (GFED5).

To further assess the ability of CLM5 to capture temporal fire dynamics, we compared monthly BA across global, tropical (20°S–20°N), and northern extratropical (NET: 30°N–70°N) regions (Figure 1e–g). CLM5 reproduces the observed double-peak seasonal cycle in the tropics, which is also reflected in the global mean due to the dominance of tropical fire activity. This pattern, visible in both GFED4.1 and GFED5, likely reflects distinct early and late dry season burning phases, though with some discrepancies in the timing and magnitudes of the peaks, likely due to known precipitation biases or underrepresentation of early dry season fires and differences in the fuel build-up season ([Hantson et al., 2020](#); [Li et al., 2024](#)). In NET regions, CLM5 overestimates BA (1.09 million km² vs. 0.37 and 0.81 million km² in GFED4.1 and GFED5, respectively), particularly during summer months, potentially due to over-sensitivity to fire weather or fuel availability. Despite these regional biases, CLM5 broadly reproduces key spatiotemporal patterns of global fire regimes. While CLM5 retains the core structure of CLM4.5, key updates to fuel moisture sensitivity and agricultural fire treatment improve fire sensitivity ([Lawrence et al., 2019](#)). Comparison of CLM performance with other fire models within the Fire Model Intercomparison Project (FireMIP) also reported that CLM reasonably reproduces the spatiotemporal variability in global fires ([Li et al., 2019](#); [Hantson et al., 2020](#)). Importantly, [Hantson et al. \(2020\)](#) reported CLM as the only model to reproduce the double-peak fire season, while all other models produce a single summer peak, indicating its improved ability to simulate fire dynamics. Recent studies have further compared different Earth system models and found CESM estimates closer to observations (e.g., [Li et al., 2024](#)).

Emissions of key fire-related species such as total carbon (TC), black carbon (BC), organic carbon (OC), and nitrogen oxides (NO_x) were also compared against GFED4.1, as data are not available for GFED5 (Figure 1d). Decadal averaged results show strong agreement for most species, with TC emission of 2017±158 Tg yr^{−1}, closely approximating the GFED4.1 estimates of 1997±175 Tg yr^{−1}. However, certain species, such as OC, are slightly overestimated, while NO_x emissions are marginally underestimated.

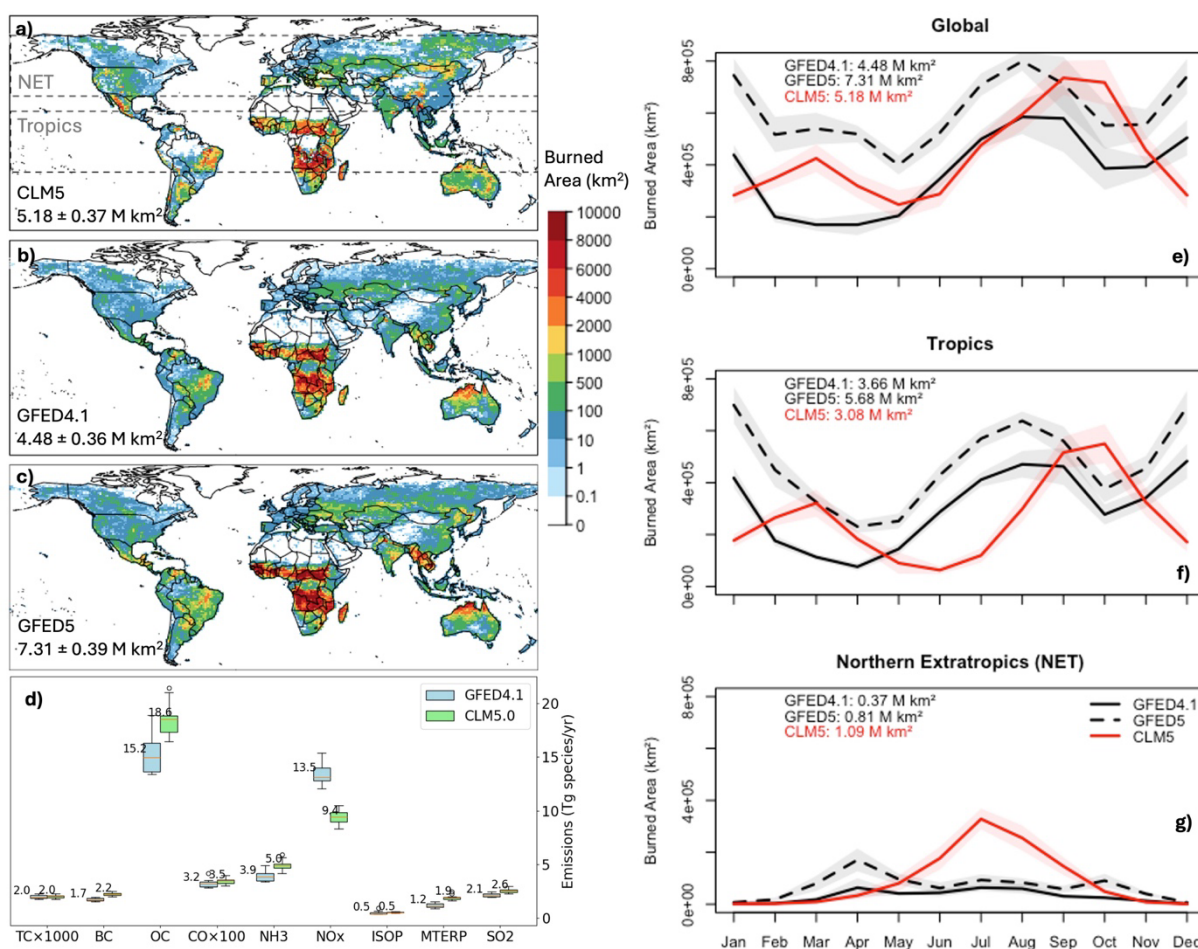


Figure 1. Comparison of CLM5-simulated results (2015–2024, SSP1) with the Global Fire Emissions Database (2007–2016 for GFED4.1; 2011–2020 for GFED5). Spatial distribution of burned area for a) CLM5, b) GFED4.1, and c) GFED5 are averaged for a decade. d) Global annual emissions of main fire-emitted species, including total carbon (TC), black carbon (BC), organic carbon (OC), carbon monoxide (CO), ammonia (NH₃), nitrogen oxide (NO_x), isoprene (ISOP), monoterpene (MTERP), and sulfur dioxide (SO₂) are compared between CLM5 and GFED4.1 for the same time period as that of burned area. Monthly climatology of BA for (e) global, (f) tropical (20°S–20°N), and (g) northern extratropics (NET: 30°N–70°N) regions are compared for CLM5 with GFED4.1 and GFED5. Shaded areas represent interannual variability (±SD).

2.5 Machine learning models

To assess the relative contribution of climate and vegetation drivers to high latitudes ($\geq 40^\circ\text{N}$) summer (JJA) BA, we trained three supervised machine learning models: XGBoost, LightGBM, and Random Forest. These models were trained on monthly grid cell-level data using predictors from CLM5 simulations: 10-cm soil moisture, total vegetation carbon (TOTVEGC), 2-m air temperature, 2-m RH, 10-m wind speed, precipitation, and climate water availability (CWA = precipitation – evapotranspiration).

Each model was trained using an 80/20 train-test split, with Bayesian hyperparameter optimization and 5-fold cross-validation. Predictive performance was assessed using the coefficient of determination (R^2) and root mean square error (RMSE) on held-out test sets for both SSP1 and SSP3 scenarios. XGBoost demonstrated the best performance across both scenarios and was selected for further interpretation (Table 1). To interpret the model outputs, we used both gain-based built-in feature importance and SHAP (Shapley Additive exPlanations) values to capture the marginal effects of each feature and their nonlinear interactions with BA.

Table 1. Performance metrics (R^2 and RMSE) for XGBoost, LightGBM, and Random Forest models in predicting boreal summer burned area under SSP1 and SSP3 scenarios.

ML model	SSP1		SSP3	
	R^2	RMSE	R^2	RMSE
XGBoost	0.70	957.48	0.62	1111.06
LightGBM	0.59	1112.72	0.54	1215.03
Random Forest	0.52	1202.24	0.49	1284.20

3. Results

3.1 Trends and spatial variations in burned area and carbon emissions

The projected impact of climate change on BA and carbon emissions shows a marked increase under low and high warming scenarios. Global BA is projected to increase by $+6383 \text{ km}^2 \text{ yr}^{-1}$ under SSP1 and $+7465 \text{ km}^2 \text{ yr}^{-1}$ under SSP3 between 2015 to 2100 (Figure 2a), resulting in an overall increase of $+0.73$ million km^2 and $+0.68$ million km^2 , respectively, by the 2090s compared to the present day. These increases are particularly centered toward the NET (Figure S2). BA reductions of $\sim 25\%$ in the tropics in high warming scenario negate BA increases in high northern latitudes, leading to a lower global average under SSP3 as compared to SSP1, which sees sharp increases in tropics (Figure 2b–d). However, the overall rate of increases in BA under SSP3 is approximately $+1000 \text{ km}^2 \text{ yr}^{-1}$ higher relative to SSP1, primarily driven by

sharp increases in fuel supply, reduced soil moisture, and favorable meteorology, such as elevated surface temperature and reductions in RH (Figure S3; see Section 3.2).

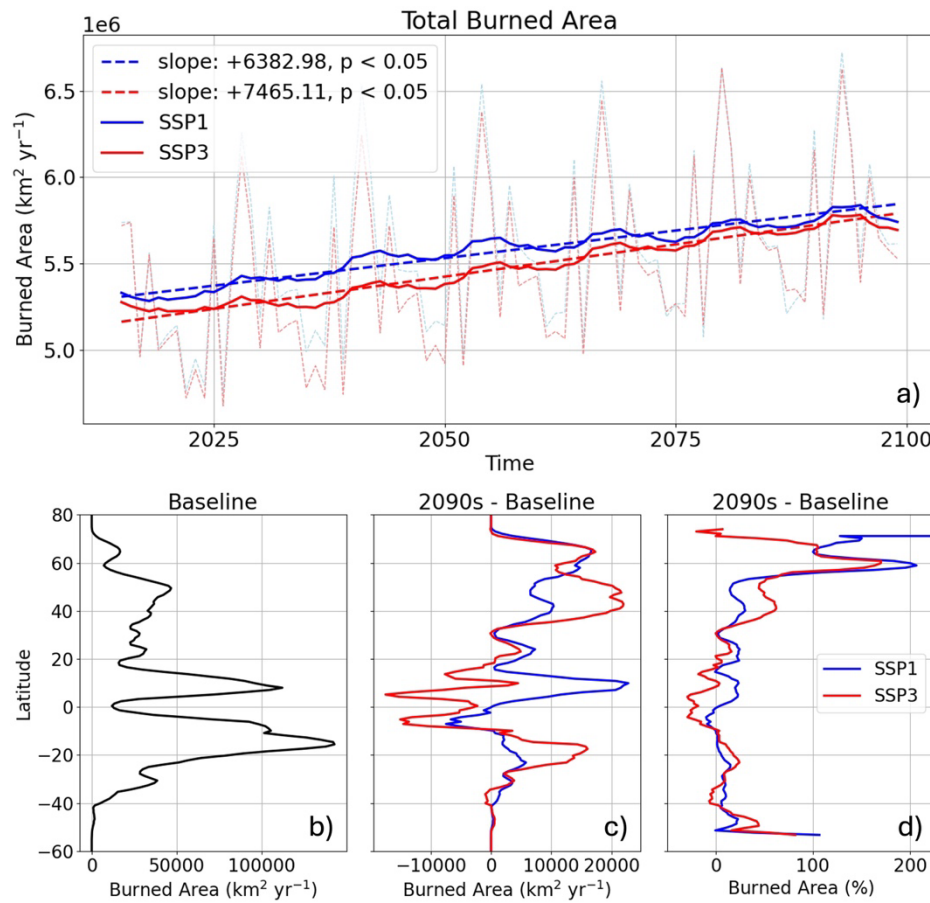


Figure 2. Trend analysis of global burned area (BA) during the 21st century (2015-2100) under SSP1 and SSP3 climate scenarios. In panel a), dotted lines indicate the annual variations and their trends, while the solid lines indicate the 30-year centered moving average. The latitudinal variations of BA during b) baseline (averaged 2015-2024; SSP1) and its c) absolute and d) percentage future differences are shown at 5-degree moving average.

We found important differences at a regional scale. In NETs, particularly near 60°N, where boreal forests dominate alongside alpine forests and shrublands, BA and TC emissions are projected to increase by over 150% in both SSP scenarios (Figure 3a-d and Figure S4). This intensification is most evident in boreal region, where the trend in BA reaches +5237 km² yr⁻¹ under SSP1 and +8515 km² yr⁻¹ under SSP3. In contrast to the pronounced increases in boreal BA, our simulations project localized decreases in BA across parts of the humid tropics as well as temperate regions such as the UK and eastern US. In tropical rainforest regions, elevated

precipitation and humidity under future climate scenarios likely suppress fire activity by maintaining higher fuel moisture levels and shortening the fire season. In temperate zones such as the UK and eastern US, projected climate changes (e.g., increased rainfall or limited warming) may reduce conditions that promote fires. These declines occur despite fixed land use and populations, indicating that purely climatic effects can suppress fire activity in certain fuel-rich or moisture-sensitive systems. Additionally, tropical regions show slight decline in BA under SSP3 ($-2429 \text{ km}^2 \text{ yr}^{-1}$) and SSP1 ($-64 \text{ km}^2 \text{ yr}^{-1}$), both remaining statistically insignificant at 95% level (Figure 3e–h). Despite the upward trends in NET fires, the tropics remain the dominant contributor to total global BA and carbon emissions during the 21st century, underscoring a shifting geographic balance of wildfire risks.

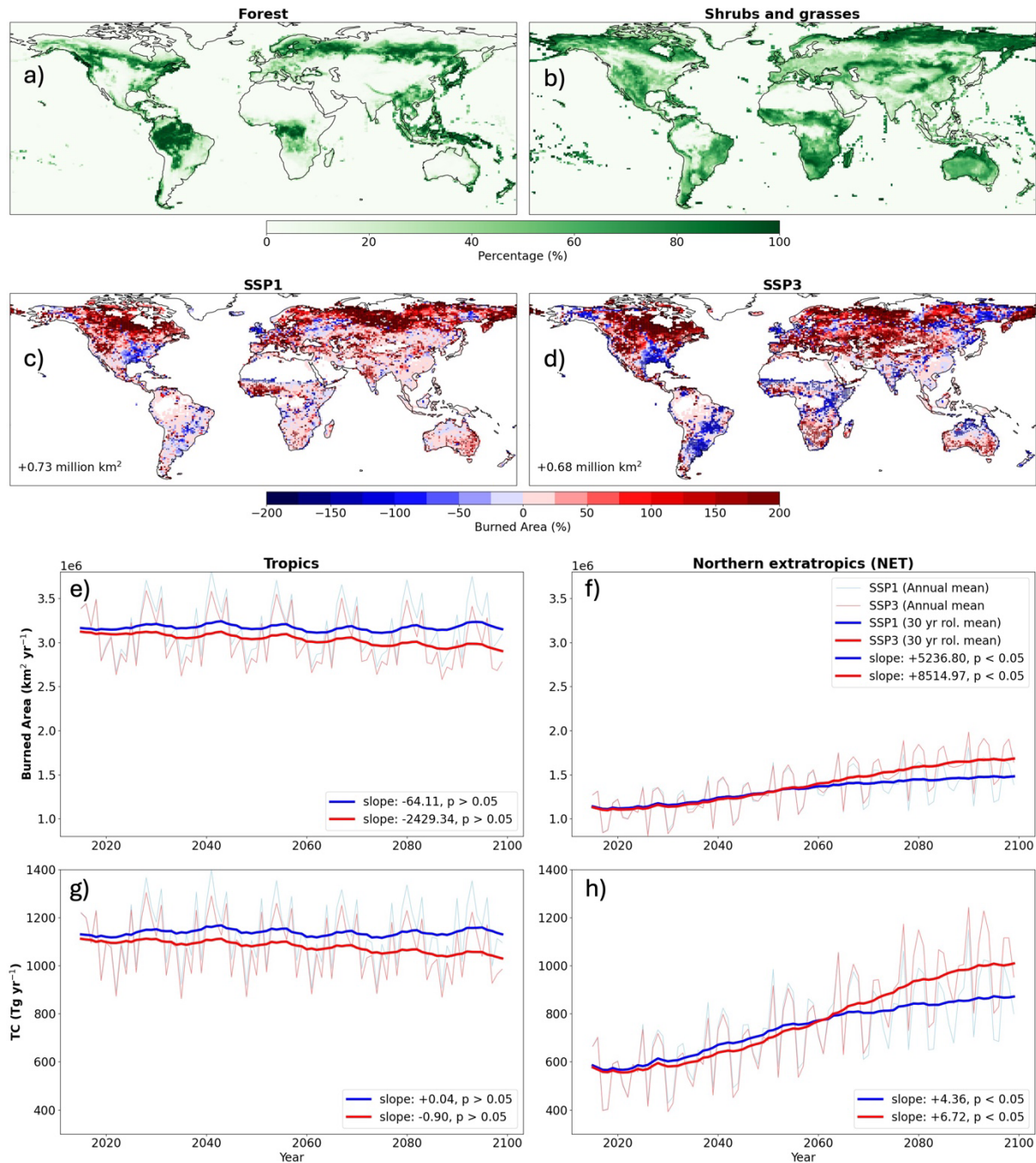


Figure 3. Spatial variations of present-day land cover: (a) forest and (b) shrubs and grasses, derived from the product of natural plant functional types (PCT_NAT_PFT) and natural vegetation (PCT_NATVEG) fractions, summed over the relevant natural PFTs (forest: 1-8, shrubs and grasses: 9-15). Percentage difference in BA [future (2090 to 2099) – baseline (2015 to 2024)] under (c) SSP1 and (d) SSP3 scenarios. Trend lines for (e, f) BA and (g, h) TC emissions are shown for tropics and northern extratropics (NET) regions throughout the 21st century. Dots in panels c and d indicate regions with significant difference at 95% confidence

interval. Lighter colors of trend lines represent annual variations, while bold lines indicate a 30-year moving average.

Differences in carbon emissions closely align with the pattern of BA (Figure 3, Figure S5). Boreal regions emerge as the primary contributors to the overall increase in TC emissions, where it increases at the rate of 4.36 Tg yr⁻¹ and 6.72 Tg yr⁻¹ under SSP1 and SSP3 scenarios, respectively. In contrast, the tropical region experiences a marginal difference in TC emissions in both scenarios. Similar trends are observed for other carbonaceous species, including BC, OC, and carbon monoxide (CO), thus, TC is emphasized in the main text as a representative carbonaceous species. By 2090s, fire-related carbon emissions are expected to rise by 22–32% compared to the present-day levels. Notably, emissions from regions above 50°N are projected to surge by more than two folds, underscoring the substantial influence of high-latitude fires in shaping future global carbon budgets. In addition, the carbon emitted from boreal fires may become as important as tropical fires, in terms of magnitude (~1000 Tg C yr⁻¹) by the end of the century in a high warming world.

Figure 4 highlights a significant shift in global fire regimes and their carbon emissions across SSP1 and SSP3 scenarios. Under both scenarios, global BA shows a slight increase during 2050s and 2090s compared to the baseline (2020s), but regional trends differ markedly. While tropical BA remains nearly stable or declines slightly, boreal BA increases significantly in both cases, rising from 1.09 million km² yr⁻¹ during baseline to 1.50 million km² yr⁻¹ under SSP1 and 1.70 million km² yr⁻¹ under SSP3. Consequently, the boreal-to-tropics BA ratio increases from 0.35 at baseline to 0.46 under SSP1 and 0.57 under SSP3, indicating the growing contribution of boreal fires relative to the tropics. Similarly, TC emissions exhibit a marked redistribution, with global emissions increasing from 2017 Tg yr⁻¹ at baseline to 2535 Tg yr⁻¹ under SSP1 and 2552 Tg yr⁻¹ under SSP3. While tropical carbon emissions decline slightly, boreal emissions surge from 547 Tg yr⁻¹ at baseline to 894 Tg yr⁻¹ under SSP1 and 1032 Tg yr⁻¹ under SSP3. This shift is also evident in the boreal-to-tropic TC emission ratio, which increases from 0.50 at baseline to 0.76 under SSP1 and 0.97 under SSP3, as well as the boreal-to-global ratio, rising from 27% to 35% under SSP1 and 40% under SSP3. These trends underscore the growing dominance of boreal fires in driving global carbon emissions under future climate scenarios, with more pronounced increases under SSP3. The results highlight

the critical role of boreal fire regimes in amplifying climate feedbacks and the need for region-specific fire management strategies to mitigate their disproportionate impact on the global carbon cycle. The interrelationships among BA, carbon emissions, and meteorological factors are further discussed in subsequent sections.

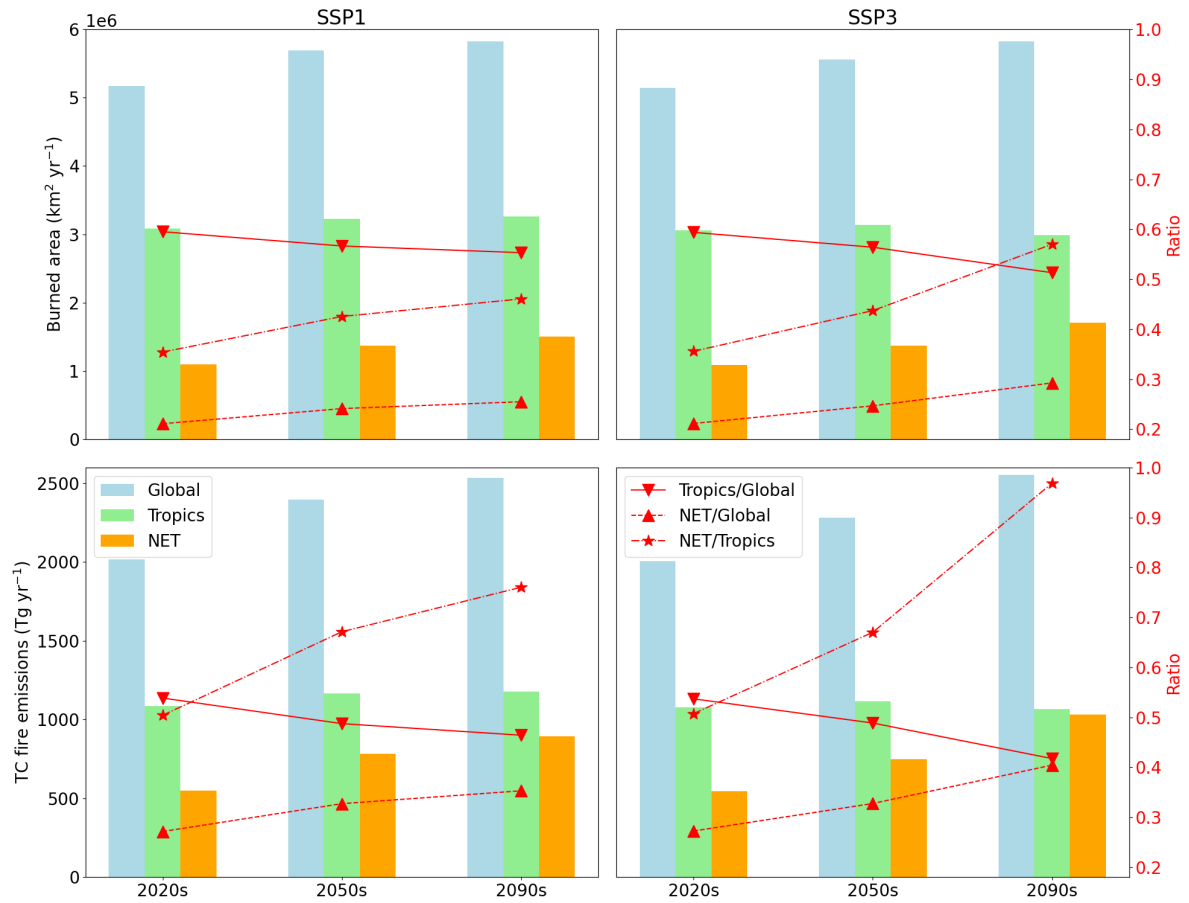


Figure 4. Present day (2020s: 2015-2024) and future (2050s: 2050-2059; 2090s: 2090-2099) decadal mean of burned area (BA) and total carbon (TC) emissions across global, tropics (20°S-20°N), and northern extratropics (NET: 30°N-70°N) regions (bar-plot) under low (SSP1) and high (SSP3) warming scenarios. The ratio of BA and TC emissions against tropics/global, NET/global, and NET/tropics is presented as line plots, which show the increasing contribution of NET region on BA and TC emissions.

3.2 Key drivers of burned area in future climates

To identify the main factors influencing climate-driven wildfires, we analyzed the spatial variations (Figure S3) and correlations between BA and meteorological factors, vegetation

dynamics, and carbon emissions. To isolate interannual variability and minimize the influence of long-term trends, we performed a Pearson correlation coefficient analysis on detrended annual mean data for each grid cell from 2015 to 2100. We found strong correlations of BA with meteorological variables, total vegetation carbon (TOTVEGC), and TC emissions for both SSP1 (Figure 5) and SSP3 (Figure S6) scenarios. BA is positively correlated with surface temperature across most fire-prone regions ($R > 0.6$), consistent with the role of warming in enhancing fuel flammability and increasing fire risks (e.g., [Abatzoglou and Williams, 2016](#); [Wu et al., 2021](#)). A strong positive correlation also appears between BA and total vegetation carbon in Eurasian (Steppe) and tropical grasslands (e.g., African savanna, parts of Australia), where warmer and wetter conditions stimulate plant productivity, thereby increasing the fuel supply and fire risks. This is also likely amplified under future elevated CO₂, which enhances photosynthesis and fuel accumulation via fertilization effects ([Lawrence et al., 2019](#); [Walker et al., 2021](#); [Allen et al., 2024](#)). Meanwhile, in forested regions, the correlation between BA and vegetation carbon is often negative, suggesting that dense woody vegetation may suppress fire through improvement in plant water use efficiency, thereby retaining soil moisture and lowering fuel flammability. These findings support the notion that herbaceous fuels respond more rapidly to fire-conducive weather, while forests may buffer such effects due to slower drying and deeper rooting ([Jones et al., 2022](#)). Effects of these individual forcing factors, such as climate, CO₂, and land use, on fuel availability and combustibility have also been previously discussed for historical fires using several climate models under FireMIP ([Li et al., 2019](#)).

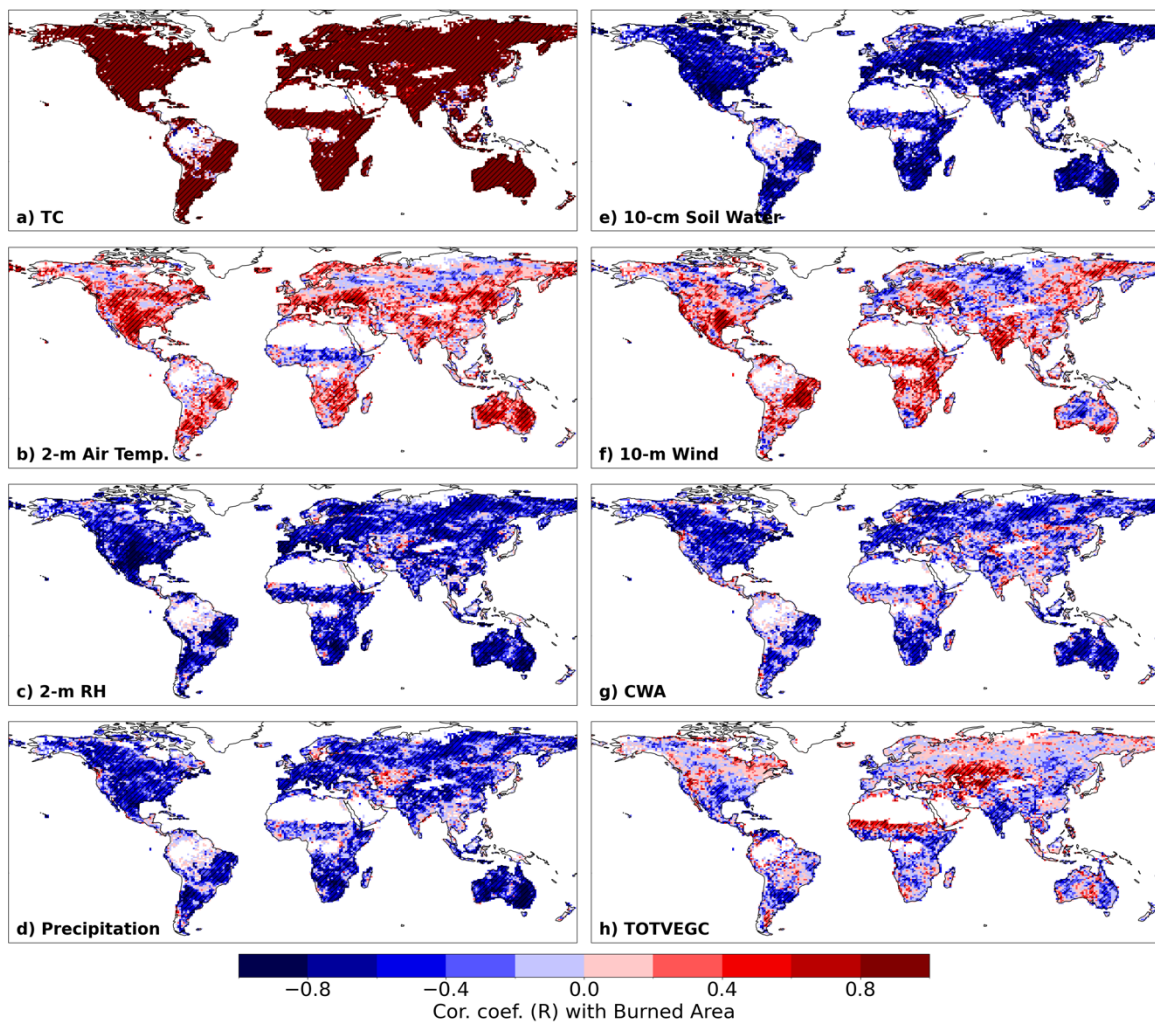


Figure 5. Pearson correlation (R) on annual mean time series data (2015 to 2100) between detrended burned area (BA) and (a) TC, (b-g) meteorological variables (2-m surface temperature, 2-m relative humidity (RH), precipitation, 10-cm soil water, 10-m wind velocity, and climate water availability (CWA = precipitation – evapotranspiration)), and (h) total vegetation carbon (TOTVEGC) under SSP1 scenario. Hatch lines are shown over regions with a 95% significance level.

BA shows widespread negative correlations with moisture-related variables (e.g., RH, 10-cm soil moisture, precipitation, and CWA), consistent with their role in suppressing fire through increased fuel moisture and reduced flammability (Jolly et al., 2015). Soil moisture, in particular, has a key indirect control on wildfire activity, influencing both vegetation stress and fuel moisture content. Although the model does not simulate dead fuel moisture explicitly, soil moisture serves as a proxy for fuel combustibility. Drier soil conditions reduce live fuel

moisture and increase the likelihood of ignition and fire spread. However, persistently dry conditions may also suppress vegetation growth and thus reduce fuel availability, which can lead to lower fire activity in some cases ([Turco et al., 2017](#)).

In tropical forests, high precipitation and soil moisture continue to reduce BA, consistent with fuel combustibility suppression. However, in semiarid savannas, modest precipitation enhancements promote grass growth, boosting fire-prone fine fuel loads. However, upper soil moisture (10 cm) may not fully represent deeper root zones in forests and can vary in flammability ([Markewitz et al., 2010](#); [Lawrence et al., 2019](#)). These contrasting relationships demonstrate region-specific climate-fire dynamics, mediated by vegetation types and fuel responses to water availability.

Wind speed shows mixed correlations with BA. In fire-prone regions such as Australia and parts of South America, positive correlations indicate that stronger winds enhance fire spread. In contrast, in some high-latitude northern regions, increased wind is possibly associated with the influx of cooler, moister air masses, leading to a suppression of fire activity.

BA shows a strong spatial correlation with TC emissions ($R > 0.80$) across most regions, highlighting the model-inherent link between area burned and carbon output. Further analysis of the differences in carbonaceous species also corroborates the robust correlation with differences in BA ($0.56 < R < 0.71$, $p < 0.05$; Figure S7), underscoring the synergetic effect of BA on carbon emissions. Although increased BA generally leads to higher emissions, a reduction in grassland BA accompanied by forest fire increases may result in higher emissions despite declining total BA ([Zheng et al., 2021](#)).

3.3. Seasonality of wildfires

Distinct seasonal variations in BA and wildfire emissions are observed for both present-day conditions and future climate forcings (Figure 6, Figure S8). The most substantial increase in BA and carbon emissions occur during the boreal summer (June to August), particularly in the Northern Hemisphere, including regions such as the western United States, Canada, and Russia (Figure S9). In the Southern Hemisphere, BA increases are predominant during its warmer periods (September to February), most notably in southern Africa and Australia. Conversely, tropical regions experience a sharp decline in BA primarily from December to March under SSP3, while SSP1 shows an increase during the same period, highlighting the varied regional response to climate change. Among these seasonal variations, NET regions exhibit a

pronounced rise in both BA and carbon emissions during the summer months, and the fire season may potentially be extended by an additional month by 2100 in temperate latitudes (30-50°N) under high-warming conditions (SSP3).

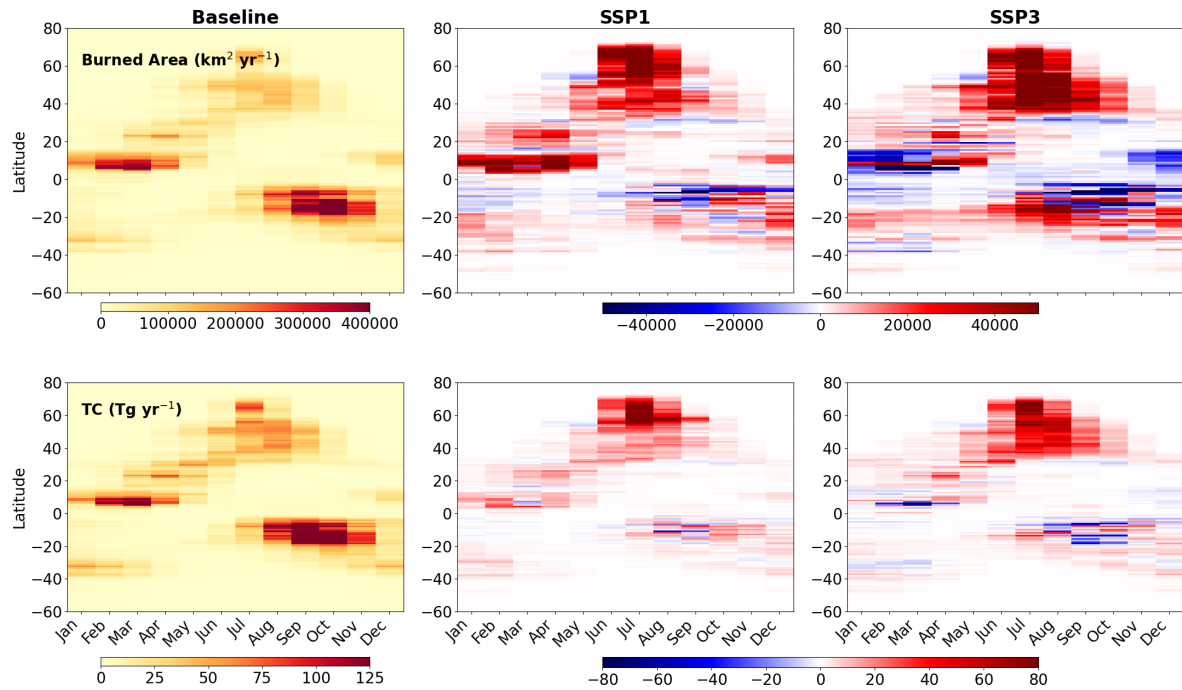


Figure 6. Latitudinal monthly variations in burned area and total carbon emissions at baseline (2015-2024 average) and their future (2090-2099 average) differences in SSP1 and SSP3.

To further investigate the drivers behind the sharp rise in BA and carbon emissions in boreal regions, we conducted a detailed analysis focusing on both summer (Figure 7) and winter seasons (Figure S10). Our results show a pronounced seasonal contrast, with the largest BA increases occurring during the boreal summer months. During this period, several climatic factors converge to create optimal wildfire conditions: higher temperatures, increased vegetation productivity, reduced RH, and lower soil moisture. These factors, especially in boreal forests, amplify fire outbreak risks. Increased vegetation, while potentially serving as a carbon sink, may contribute to higher fire risks by increasing fuel availability, especially under warmer and drier conditions (Flannigan et al., 2009).

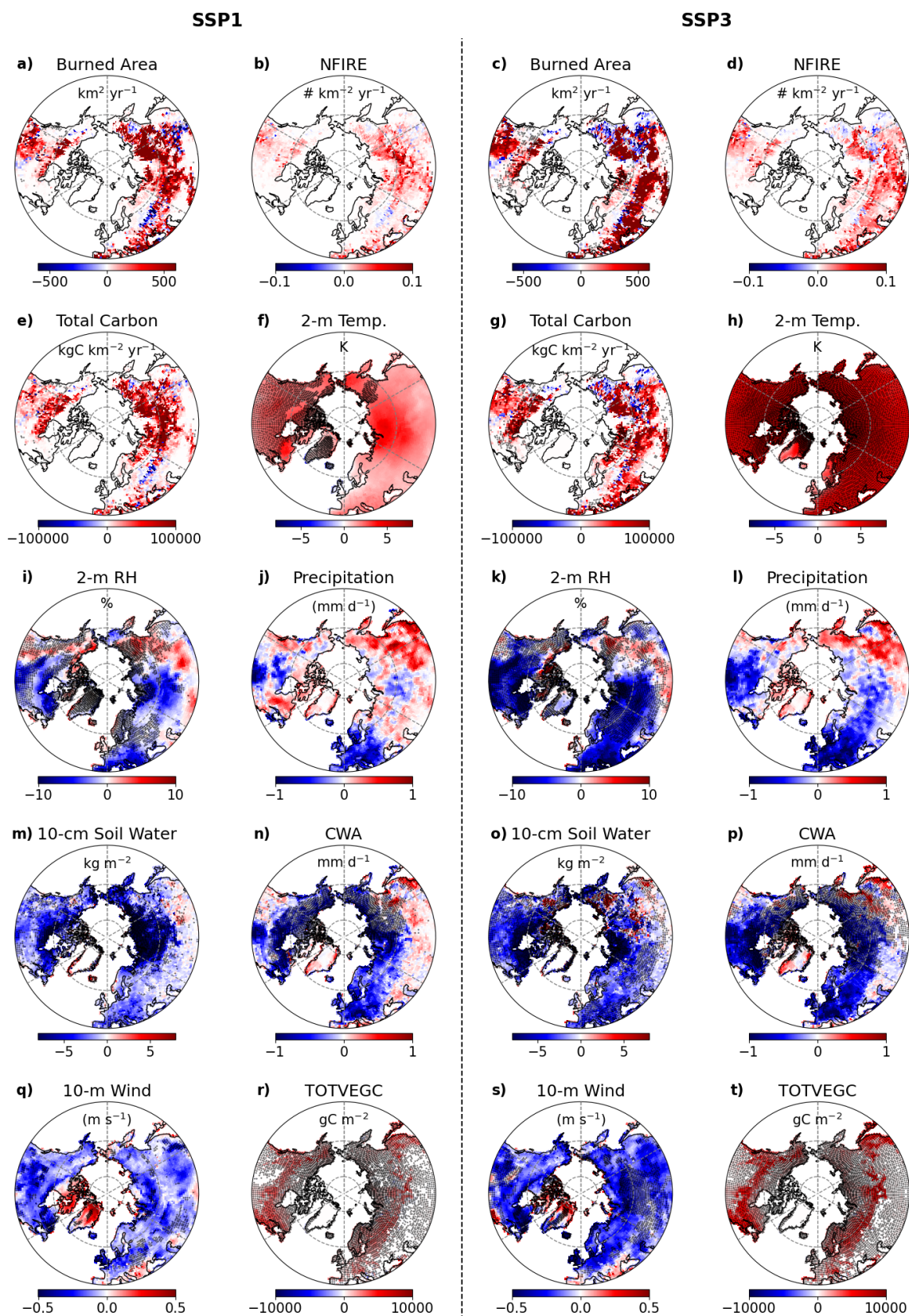


Figure 7. The 2090s fire season (JJA) anomaly (relative to the present day) for modeled burned area, number of fires (NFIRE), BC emissions, meteorology, and total vegetation carbon

(TOTVEGC) in the boreal region ($\geq 40^{\circ}\text{N}$) for SSP1 and SSP3. Dots indicate regions with a 95% significance level.

Both SSP1 and SSP3 scenarios predict a significant rise in boreal wildfires, with the increase notably more severe under SSP3, where heightened temperatures result in steeper declines in RH and CWA. Elevated temperatures exacerbate evapotranspiration, leading to drier vegetation and surface conditions that further amplify fire risks. In contrast, the winter season exhibits minimal differences in BA, despite rising temperatures and reduced RH. Extreme winter cold effectively suppresses wildfire ignition, regardless of potential climatic shifts. Elevated soil moisture and CWA during winter, combined with frozen ground and snow cover, limit fire activity, as projected warming remains insufficient to reach the threshold required to sustain fire during winter.

Spatial analysis reveals that the most significant increases in BA and fire emissions occur in boreal Eurasia, where temperature anomalies are especially pronounced. This region shows large areas of intensified fire activity, with isolated pockets of reduced BA under SSP3, possibly due to increased winter precipitation or soil moisture that offsets fire risk.

Feature importance results consistently identify 10-cm soil water content (influencing fuel availability and dryness) and vegetation carbon (influencing canopy and surface fuel loads) as primary predictors of wildfire activity (Figure 8). These two factors alone explain over 40–50% of model variance. While CLM5 does not explicitly simulate dead fuel moisture, lower soil moisture is often associated with drier fuels, increasing fire susceptibility.

SHAP analysis further reveals the nonlinear and context-dependent behavior of environmental drivers. Low soil moisture and high vegetation carbon values substantially increase predicted BA, underscoring the critical role of dry and abundant fuels. Surface temperature and RH show moderate yet consistent effects: higher temperatures and lower RH are associated with elevated fire risks. In contrast, precipitation and wind speed exhibit weaker and more variable influences, often depending on local fuel conditions. Moreover, high CWA contributes to elevated BA as it may facilitate vegetation growth and thus indirectly accumulate fuel required for fires, reflecting fuel accumulation during wetter conditions followed by subsequent drying. These insights emphasize both the dominant controls and complex interdependencies shaping wildfire

risks in boreal regions. Although these ML results provide useful diagnostic insights into feature importance, they are inherently limited by the underlying correlations in the input variables and model structure. Future work should explore process-level attribution through sensitivity simulations using fixed climate forcings within CLM5.

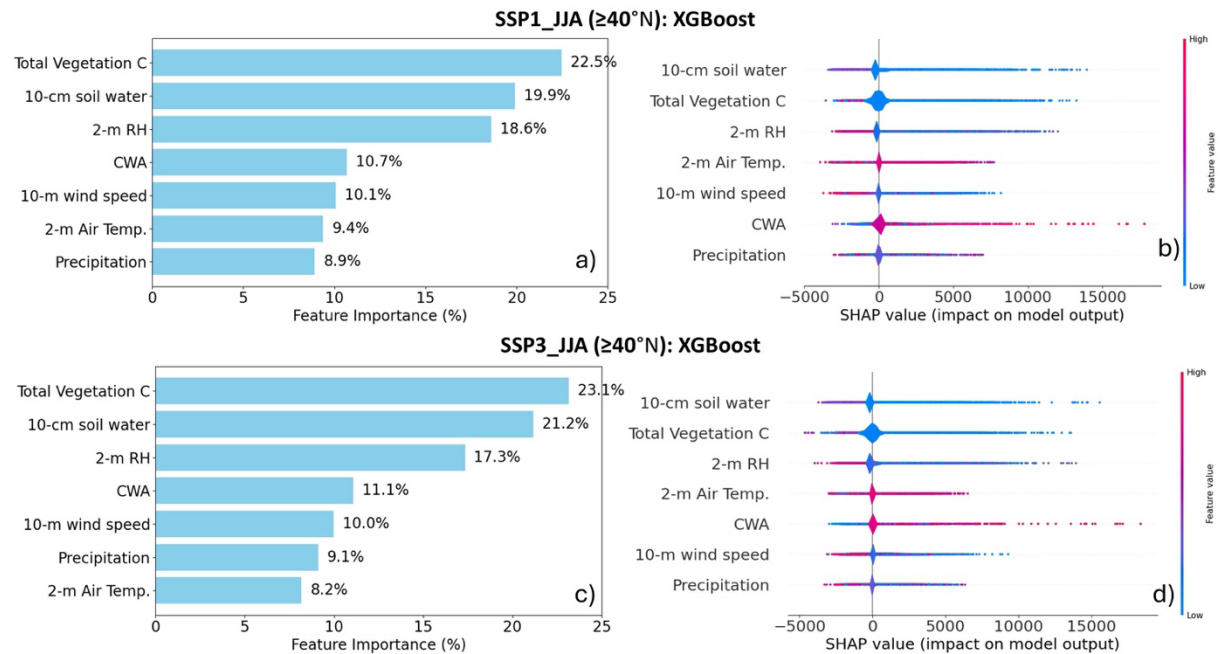


Figure 8. Feature importance and SHAP summary plots showing analysis of environmental drivers of wildfire activity during boreal summer (JJA) over northern latitudes ($\geq 40^\circ\text{N}$) using XGBoost machine learning model under (a, b) SSP1 and (c, d) SSP3 scenarios.

This analysis underscores the need for a deeper understanding of the interplay between climatic drivers, vegetation dynamics, and fire behaviors to mitigate boreal wildfire risks under future climate scenarios. While machine learning models identify soil water content and vegetation carbon as the most critical predictors of wildfire activity, rising surface temperatures play an indirect yet pivotal role. Elevated temperatures exacerbate evapotranspiration, reduce RH, and lower soil moisture, thereby intensifying fire risk. These cascading effects highlight the importance of considering temperature as a key enabling factor that interacts with vegetation and hydrological conditions to drive wildfire dynamics. Additionally, the positive correlation between BA and vegetation carbon suggests that future fire management strategies should consider shifts in vegetation growth patterns driven by changing climatic conditions, particularly in boreal ecosystems where temperature and water availability are limiting factors.

Under low and high warming climates, the projected sharp rise in boreal wildfires emphasizes the necessity of comprehensive fire management strategies that address the complex links between climate and vegetation, as well as the seasonality of these interactions. The expected increase in high-latitude fire activity and associated carbon emissions will significantly contribute to the global carbon budget. Targeted mitigation efforts, such as prescribed burns or enhanced fire suppression during critical periods, will be crucial. Furthermore, the cascading impacts of wildfires on carbon cycling and atmospheric composition – including increased emissions of BC and OC – highlight the urgency of adaptive strategies. These strategies must account for the feedbacks between climate change, vegetation growth, and fire behaviors to effectively manage future wildfire risks.

4. Conclusions and discussion

This study highlights a significant shift in wildfire dynamics, particularly in NET regions under future climate scenarios, using a state-of-the-art fire-enabled global terrestrial system model that explicitly simulates interactive fire with active biogeochemistry. Our findings indicate that boreal regions, especially around 60°N, could experience a staggering increase in BA by up to 200% under high-warming scenarios (SSP3-7.0), primarily driven by reduced soil moisture and increased vegetation carbon, creating dryer and more combustible conditions. These results align with previous studies predicting an intensification of Arctic fires due to climate-induced extreme fire weather, increased lightning activity, and drier fuel conditions ([Mccarty et al., 2021](#)). Furthermore, [Abatzoglou et al. \(2019\)](#) explored that regions experiencing heightened fire weather could double at 3°C warming compared to 2°C above preindustrial levels, emphasizing the significant influence of anthropogenic climate change ([Turco et al., 2023](#)).

While warming and drying conditions dominate fire risk trends, elevated atmospheric CO₂ plays an important complementary role by increasing vegetation carbon and influencing plant water dynamics. In CLM5, CO₂ fertilization enhances photosynthesis and plant growth, contributing to greater fuel loads in fire-prone biomes, particularly at high latitudes. CO₂ also improves water-use efficiency, which can buffer soil moisture loss under warming. Although our simulations apply changing CO₂ and climate simultaneously, making it difficult to isolate their respective effects, their combined impact is evident in regions where biomass accumulation and fuel dryness jointly elevate BA and emissions. This highlights the

importance of considering both physiological and climatic fire drivers in future scenario planning.

Our results also emphasize the role of other meteorological variables in modulating fire activity. While rising temperatures and CO₂-driven vegetation growth contribute to heightened fire risks, wind speed and precipitation exert secondary influences. Stronger wind speed at high latitudes can suppress fire spread by transporting colder, moist air, whereas increased precipitation can paradoxically increase fire risk by stimulating vegetation growth in water-stressed areas, thereby increasing fuel loads. These results are consistent with historical wildfire studies ([Zheng et al., 2023](#)), which documented that warmer and drier conditions in boreal forests contributed to the rapid wildfire expansion from 2000 to 2020. Our findings further extend these insights into the future, demonstrating how climate and vegetation changes will continue shaping wildfire trends.

The projected intensifications of NET fires has significant ecological and climatic implications. Increased fires in sub-alpine regions reduce species diversity, leading to greater forest homogeneity and disrupting entire ecosystems ([Cassell et al., 2019](#); [Halofsky et al., 2020](#)). The transition of boreal forests from carbon sinks to net carbon sources due to increased fire emissions could further amplify warming trends through enhanced greenhouse gas concentrations and BC deposition on Arctic ice, accelerating ice melt (e.g., [Liu et al., 2014](#); [Mccarty et al., 2021](#); [Virkkala et al., 2025](#)). Furthermore, the degradation of boreal ecosystems threatens biodiversity, disrupts regional hydrological cycles, and deteriorates air quality due to increases in particulate and ozone precursors. These findings underscore the necessity for integrating wildfire dynamics into climate policy frameworks to effectively mitigate future risks.

While NET wildfires exhibit a strong upward trend, tropical regions exhibit a contrasting response, with either stable or decreasing trend in BA under future climate scenarios. This pattern is consistent with previous studies ([Veira et al., 2016](#); [Jones et al., 2022](#)), which reported increasing BA at higher latitudes but declines in the tropics. Climate driven alternations in temperature and precipitation patterns introduce uncertainties in fire regimes across different biomes, highlighting the complexity of climate-fire interactions ([IPCC, 2014](#); [Fasullo et al., 2018](#)).

Seasonal variations further illustrate the complexity of factors governing wildfire dynamics. Despite rising temperatures in boreal summer and winter, the sharp rise in BA and carbon emissions in the NET region is confined to summer, as winter wildfires are suppressed by persistent cold temperatures and snow cover. Additionally, in temperate regions (30–50°N), high warming scenario extended the fire season, leading to longer fire durations ([Senande-Rivera et al., 2022](#)). Moreover, in the recent two decades, the extreme wildfire events have increased by twofold, particularly in boreal and temperate conifer regions ([Cunningham et al., 2024](#)). These findings emphasize the need for seasonally and regionally tailored fire management strategies. In temperate, populated regions, targeted interventions such as controlled burns, thinning or fuel reductions, and soil moisture enhancement can mitigate wildfire risks. However, in sparsely populated NET regions, where large-scale fires occur in remote landscapes with limited accessibility, direct intervention is often challenging due to larger fire size and lower government priority. Thus, integrating wildfire risks into climate impact assessments, carbon sequestration estimates, and long-term climate feedback analysis is crucial for understanding the broader implications of NET wildfires. Predictive models incorporating wind speed, precipitation patterns, and fuel accumulation dynamics can further aid in resource allocation and preparedness efforts. A nuanced approach that considers both management feasibility and the role of NET fires in global climate systems will be essential for mitigating their impacts on air quality, biodiversity, and human health under future climate scenarios.

Several limitations of this study warrant further investigation and consideration when interpreting our results:

- Attribution experiments: Our study isolates the climate effect by holding anthropogenic influence (changes in land use and population density) constant. While this provides a controlled framework for evaluating climate-driven wildfire risks, real-world fire dynamics are shaped by a broader set of factors. Future land use changes – such as agricultural expansion, forest fragmentation, or abandonment – can alter fuel continuity and flammability. For instance, fragmentation may reduce fire spread by breaking fuel connectivity, while deforestation or abandonment could increase fire risk by creating more open, combustible landscapes. Similarly, population growth and urbanization may lead to more frequent human ignitions or enhanced suppression capacity, depending on regional context. These socioeconomic dynamics, which have already

contributed to declining BA in recent decades (e.g., [Andela et al., 2017](#); [Forkel et al., 2019](#)), are not captured in our simulations. In addition, our interpretation of fire-climate relationships is based on statistical methods, which are inherently correlative. Future research would benefit from targeted sensitivity simulations that systematically vary climate drivers (e.g., CO₂, temperature, precipitation) or land use parameters, either independently or in combination. Such factorial experiments would enable more rigorous causal attribution and improve confidence in regional fire projections under complex future scenarios.

- Regional differences: Relative importance of climate versus human activity is expected to differ across regions. Boreal ecosystems are primarily sensitive to climatic factors such as fuel availability, soil moisture, and fire weather conditions, whereas tropical regions are more strongly influenced by human land use change, agricultural expansion, and fire suppression practices (e.g., [Andela et al., 2017](#); [Forkel et al., 2019](#); [Wu et al., 2021](#)). This regional heterogeneity highlights the need for caution when interpreting climate-only fire projections, particularly in human-dominated landscapes. Notably, our findings show that the largest projected increase in BA and carbon emissions occur in boreal regions, where human activity is comparatively limited. This reinforces the robustness of our climate-driven projections in these areas. Conversely, the simulated declines in tropical burned area despite constant socioeconomic forcings suggest that climate-induced changes, such as increased precipitation, may independently drive fire suppression in some regions. These contrasting patterns underscore the critical role of regional context in interpreting future wildfire trends.
- Model resolution and representation: The CLM5 model, with its relatively coarse spatial resolution (~100 km), may lead to underrepresentation of short-term and small-scale fires, particularly those driven by local ignition sources, land use changes, or fine-scale vegetation patterns. These fires, although individually small, can have cumulative ecological and atmospheric impacts, especially in fragmented landscapes or human-dominated regions. Additionally, our analysis relies on 10-cm topsoil moisture as a proxy for assessing fuel dryness, which may not fully reflect water availability for deep-rooted vegetation in forest ecosystems. However, CLM5 fire module internally relies on root-zone soil wetness to estimate fuel combustibility, which captures moisture availability over a deeper soil profile. This distinction introduces some approximation

in our interpretation, especially in ecosystems where deeper soil layers better reflect vegetation water access and fire susceptibility.

- Ignition sources and feedback effect: Natural ignitions are prescribed based on NASA lightning frequency data averaged from 1995 to 2011, limiting the scope of future variability. Future studies should integrate interactive lightning simulations that evolve with changing climate conditions. Improved representations of fire behavior, vegetation dynamics, two-way feedback mechanisms, and socioeconomic drivers will be essential to comprehensively understand wildfire risks in a changing climate. Coupling fire models to atmospheric models can also enhance our understanding of how wildfires influence regional meteorology and, in turn, how these altered conditions impact fire activity.
- Uncertainty quantification: Our single-model approach does not explicitly account for model structural uncertainty, parameter sensitivity, or internal variability from ensemble simulations. While our study using CLM5 provides a controlled framework to isolate climate-driven fire responses, multi-model comparisons such as those conducted in the FireMIP initiative ([Hantson et al., 2016](#); [Teckentrup et al., 2019](#); [Burton et al., 2024a](#)) have shown that inter-model differences can lead to considerable spread in regional and global BA estimates. Additionally, [Jones et al. \(2022\)](#) demonstrated that uncertainty in fire emissions can stem from interactions between land cover change and fire suppression assumptions. Future studies should incorporate ensemble simulations or model intercomparison frameworks to more robustly assess projection uncertainty and guide policy-relevant interpretation.

Our findings have broader implications for sustainable forestry and global climate policies. Balancing biomass harvesting with carbon sequestration goals is crucial for maintaining ecosystem resilience. While afforestation and reforestation can enhance carbon storage, in fire-prone regions these efforts must be carefully evaluated to avoid unintentionally increasing fire risks. Reforestation strategies should prioritize fire-adapted species, ecosystem-appropriate fuel management, and resilience to projected climate extremes. A comprehensive understanding of climate-fire-vegetation feedbacks is essential for developing robust adaptation and mitigation strategies that align with global sustainability objectives.

Author contributions

HB: Writing – original draft, Methodology, Validation, Visualization, Formal analysis, conceptualization. **MVM:** Writing – review & editing, Validation, Formal analysis, Data curation. **SS:** Writing – review & editing. **DHYY:** Writing – review & editing, Formal analysis. **APKT:** Writing – review & editing, Validation, Supervision, Software, Methodology, Funding acquisition, conceptualization.

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