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Impacts of wildfire smoke aerosols on near-surface ozone photochemistry

Jiaqi Shen¹, Ronald C. Cohen^{2,3}, Glenn M. Wolfe⁴, Xiaomeng Jin¹

¹Department of Environmental Sciences, Rutgers, The State University of New Jersey, New Brunswick, New Jersey 08901, United States

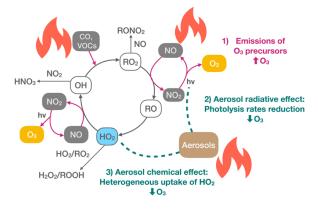
²Department of Chemistry, University of California Berkeley, Berkeley, California 94720, United States

³Department of Earth and Planetary Sciences, University of California Berkeley, Berkeley, California 94720, United States

⁴Atmospheric Chemistry and Dynamics Laboratory, NASA Goddard Space Flight Center, Greenbelt, MD 20771, United States

Correspondence to: Xiaomeng Jin (xiaomeng.jin@rutgers.edu), ORCID: 0000-0002-6895-8464

Abstract. Wildfires have been an increasing concern for the environment, yet the ozone (O₃) production from wildfires remains poorly characterized. Here, we aim to elucidate the role of aerosols from wildfire smoke in near-surface O₃ photochemistry by integrating insights from 0-D box model (F0AM) to 3-D chemical transport model (GEOS-Chem). While smoke aerosols typically inhibit O₃ production through heterogeneous chemical and radiative pathways, we find that the positive effects of precursor emissions outweigh the negative effects of aerosols for most fires. The relative importance of the two aerosol effects varies, with the heterogeneous chemical effect generally overshadowing the radiative effect in the far field of fires. However, near the sources of extremely large fires, the radiative effect dominates, leading to an overall suppression of O₃ production. By assessing the chain termination of hydrogen oxide radicals (HO_x) and introducing the "light-limited" regime determination in GEOS-Chem, we find that a significant portion of O₃ production occurred within light-limited and heterogeneous chemistry-inhibited regimes during the 2020 wildfire season in California. Building on the discovery that both aerosol and nitrogen oxide (NO_x) concentrations modulate aerosol influence, we demonstrate that the surface PM_{2.5} to tropospheric NO₂ column ratio—a metric retrievable from satellite—can serve as an indicator for identifying aerosol-dominated regimes through observations.





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Summary. This study shows large chemical and radiative effects of smoke aerosols from fires on near-surface O₃ production. Aerosol loading and NO_x levels are identified as the primary factors influencing these effects. Furthermore, we show that the surface PM_{2.5} to NO₂ column ratio can be used as an indicator for identifying aerosol-dominated regimes, facilitating the assessments of aerosol impacts on O₃ formation through satellite observations.

1. Introduction

Over recent years, wildfires have surged in size and severity (Cattau et al., 2020; Collins et al., 2021; Hanes et al., 2019; Li and Banerjee, 2021), presenting escalating challenges to air quality, ecosystems, social economics and human health (Duane et al., 2021; Jaffe et al., 2020; Jones et al., 2022; Reid et al., 2016; Wardle et al., 2003). Wildfires release substantial amounts of carbon monoxide (CO), volatile organic compounds (VOCs), oxides of nitrogen (NO_x) and aerosols or particulate matter (PM) (Akagi et al., 2011). Wildfires also markedly complicate O_3 air pollution mitigation, as many studies have documented exceedances of the O_3 air quality standard and enhanced background O_3 level due to fires (Dreessen et al., 2016; Gong et al., 2017; Jaffe et al., 2004; Jaffe and Wigder, 2012). Fires not only emit abundant O_3 precursors but also provide important sources of hydrogen oxide radicals (HO_x = OH + HO₂ + organic peroxy radical (RO₂)) through the photolysis of nitrous acid (HONO), formaldehyde (HCHO) and O_3 ; these radicals catalyze the chain oxidation of VOCs in the presence of NO_x to produce O_3 (Jaffe and Wigder, 2012; Xu et al., 2021). The NO_x-VOCs-radical controlled O_3 formation mechanism has been well-established over several decades (Pusede et al., 2014).

The impact of aerosols on O₃ formation, particularly in the context of wildfires, remains poorly understood. Generally, aerosol particles affect O3 chemistry through two mechanisms: a radiative effect and a chemical effect. The radiative effect occurs when aerosols reduce light transmission, thereby slowing down photochemical reactions (He and Carmichael, 1999). The chemical effect refers to the role of aerosols in providing surfaces for the reactive uptake of HO₂, RO₂, oxygenated volatile organic compounds such as HCHO and reactive nitrogen species including NO₂, NO₃ and N₂O₅; among these chemical effects, HO₂ uptake dominates, especially in the daytime near-surface O₃ chemistry (Carlos-Cuellar et al., 2003; Ha et al., 2020; Jacob, 2000; Li et al., 2019). Aerosols typically inhibit O₃ formation (Benas et al., 2013; Jiang et al., 2012; Li et al., 2019; Xu et al., 2012), except in certain instances where the reduction in photolysis rates disproportionately affects O3 loss more than O3 production (Real et al., 2007). O3 formation in wildfires exhibits considerable variability, with some studies reporting even suppressed O₃ in plume center or downwind areas and in Mediterranean/boreal regions (Alvarado et al., 2010; Paris et al., 2009; Strada et al., 2012; Verma et al., 2009). Model studies often invoke underestimated heterogeneous chemistry as a source of persistent bias in overpredicting O₃ (Jaffe and Wigder, 2012; Konovalov et al., 2012), yet, the impacts of aerosols on O₃ chemistry remain notably under-characterized. There is a pressing need to comprehensively evaluate the chemical and radiative effects of aerosols across different types of fires and at various stages of fire aging. Furthermore, understanding conditions under which fire emissions of NOx or VOCs, or aerosols predominate is crucial for detangling the fire-related O₃ chemistry.

Photochemical regimes indicating O₃ sensitivity towards different precursor emissions, have been used to guide regional air quality control strategies (Kleinman, 1994; Kleinman et al., 1997; Milford et al., 1994; Tonnesen



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and Dennis, 2000a, b). The two classical O₃ regimes are NO_x-limited and NO_x-saturated (or VOC-limited). O₃ production is fueled by HO_x and the termination of the HO_x free radical chain by either self-reaction to yield peroxides (NO_x-limited) or with NO_x to yield HNO₃ and RONO₂ (NO_x-saturated) defines the regime (Ivatt et al., 2022; Sillman and He, 2002). However, large aerosol loadings—typical of wildfire smoke and many polluted areas, often complicate O₃ formation in ways that the classical regimes do not capture. For instance, an aerosol-inhibited regime was recently identified in heavily polluted areas of China and India, pointing to strong impact of heterogeneous chemistry on O₃ formation (Ivatt et al., 2022). Moreover, dense smoke can create a dark environment that makes O₃ production limited by light. As wildfires intensify and smoke plumes spread to downwind urban areas, understanding if and how such aerosol-inhibited behavior occurs in wildfire plumes becomes crucial for potential policy interventions and more accurate fire-related O₃ predictions. Therefore, in this study, we refine the standard O₃ regime framework by introducing two new regimes: the aerosol heterogeneous chemistry-inhibited regime and the light-limited regime to better represent the role of aerosols in O₃ formation.

The 2020 California fires provide a valuable opportunity to study the impacts of aerosols on O₃ chemistry in wildfire plumes because they were especially extensive, varied in their intensity and well documented. Throughout the year, 8648 fires burned approximately 4.3 million acres across the state, with intense fire activity spanning from mid-August to November (CAL FIRE, 2020a). The widespread wildfire season in the western US in 2020, far from being an outlier, is considered a harbinger of a new norm in a warming climate (Coop et al., 2022; Xie et al., 2022). PM_{2.5} pollution in western US is projected to double or even triple by the late 21st century under intermediate- and low-mitigation scenarios (Xie et al., 2022).

In this study, we employ a 3-D global chemical transport model (GEOS-Chem) and a box model (Framework for 0-D Atmospheric Modeling, F0AM) as well as observational constraints to elucidate the aerosol chemical and radiative effects on O₃ production in the near field and far field of fires, as well as for different types of fires. We examine the role of emissions and of aerosols in O₃ production and delve into the reasons underlying the processes. We provide a comprehensive evaluation of O₃ production regimes by introducing two additional regimes, light-limited and aerosol chemistry-inhibited, to the well-established two-regime (NO_x-limited and VOC-limited) classification. Furthermore, we explore the potential of the PM_{2.5} to NO₂ ratio as an indicator for identifying aerosol-dominated regimes. We derive the threshold based on the model diagnostic approach and apply it to observation-derived PM_{2.5} and NO₂ datasets to distinguish the aerosol-dominated O₃ regimes.

2. Materials and Methods

2.1 GEOS-Chem simulations

We use the GEOS-Chem (Bey et al., 2001) chemical transport model version 12.7.1 to examine the effects of aerosols on O₃–NO_x–VOCs chemistry. We run nested simulations over California regions (27° N–47° N, 110° W–130° W) with a resolution of 0.25° (latitude) × 0.3125° (longitude) and 47 vertical levels for the year 2020. The model is driven by the Goddard Earth Observation System Forward Processing product (GEOS-FP) assimilated meteorological field, with a three-hour temporal resolution for three-dimensional variables and one-hour resolution



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for surface variables. Boundary conditions for the simulations are generated from a global simulation at a resolution of $2^{\circ} \times 2.5^{\circ}$ with one-year spin-up. The standard tropospheric chemical scheme includes detailed O_3 – NO_x –VOCs–aerosol–halogen chemistry. Additionally we have incorporated the ethene and ethyne chemistry as introduced in GEOS-Chem version 13.3.0 (Kwon et al., 2021). The anthropogenic emissions in US are represented using the EPA 2011 National Emission Inventory (NEI) data, scaled based on the national interannual variation in emissions. Fire emissions are sourced from the Global Fire Emissions Database (GFED, Version 4.1), with emissions categorized by fuel types, including tropical forest, temperate forest, boreal forest, savanna, peat and agricultural waste (Randerson et al., 2015). We allocate 65% of these fire emissions within the boundary layer (Fischer et al., 2014).

Photolysis rates in GEOS-Chem are calculated using the fast-JX scheme (Bian and Prather, 2002). The influence of aerosols on the photolysis rates are considered (Martin et al., 2003), with the adjustments for aerosol size distribution and optical properties in response to relative humidity changes. GEOS-Chem treats black carbon (BC) as externally mixed, making it challenging to explicitly simulate the lensing effect, where BC exhibits larger absorption when coated by a non-absorbing shell. To incorporate this effect, we apply an absorption enhancement factor (the ratio of mass absorption efficiency (MAE) with and without coating) of 1.5 to hydrophilic BC and 1 for hydrophobic BC (Wang et al., 2014).

The heterogeneous uptake of HO₂ is represented by a reaction probability parameterization as shown in Eq. (1), with the loss rate limited by diffusion or free molecular collision (Martin et al., 2003).

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$$k = (\frac{a}{D_a} + \frac{4}{\gamma \gamma})^{-1} A$$
 (1)

k is the first-order rate constant for the chemical loss of the gas (i.e., HO₂) with mean molecular speed ν , gas-phase molecular diffusion coefficient D_g , and interacting with aerosols of radius a. γ denotes the reaction probability upon impacting the aerosol surface. Consistent with numerous modeling studies (Ivatt et al., 2022; Jacob, 2000; Li et al., 2019; Martin et al., 2003), we adopt a uniform value of 0.2 for γ_{HO_2} , aligning with the field measurements (Taketani et al., 2012; Zhou et al., 2020, 2021). A summary of γ_{HO_2} reported in previous laboratory measurements and field studies is provided in Table S1. The HO₂ loss is iterated over various aerosol types in GEOS-Chem, including the organic carbon, black carbon, sulfate-ammonium-nitrate, sea salt separated in two size bins and mineral dust in seven size bins.

To examine the aerosol effects on O₃, we conduct (1) BASE simulation and five perturbation simulations in GEOS-Chem: (2) BASE_NO_RAD, where aerosol extinction on photolysis rates is not applied, (3) BASE_NO_CHEM, where the heterogeneous HO₂ uptake is turned off, (4) NO_FIRE with fire emissions switched off, (5) NO_FIRE_NO_RAD, where both fire emissions and aerosol radiative effect are deactivated, (6) NO_FIRE_NO_CHEM, which turns off both fire emissions and reactive uptake of HO₂ by aerosols. The difference between BASE and BASE_NO_RAD is considered as the radiative effect of all aerosols, and the difference between NO_FIRE and NO_FIRE_NO_RAD represents the radiative effect of aerosols other than fire smoke aerosols. The radiative effect of fire smoke aerosols is therefore calculated as BASE – BASE_NO_RAD – (NO_FIRE – NO_FIRE_NO_RAD). Similarly, the chemical effect of smoke aerosols is calculated as BASE – BASE_NO_CHEM – (NO_FIRE – NO_FIRE_NO_CHEM). Hourly species concentrations, meteorology, photolysis rates and reaction rates for the bottom five layers of the model (approximately 0–550 m) are averaged to investigate aerosol effects on



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near-surface O_3 and perform regime calculations. We evaluate model predicted O_3 with daily ground measurements from the EPA Air Quality System (AQS) (EPA AQS, 2020), as depicted in SI Figure S1. The modeled average O_3 levels in California for 2020 are approximately 48 ± 4.3 ppb, in good agreement with ground observations of 44 ± 8.6 ppb (R^2 of 0.73).

2.2 Fire plume evolution analysis

The Eulerian framework of GEOS-Chem simulations does not provide information about plume evolution. We select about 470 fire plumes for September 2020 that show clear plume patterns with an identifiable plume source and use the Hybrid Single-Particle Lagrangian Integrated Trajectory (HYSPLIT) dispersion model to calculate plume trajectories and plume age. The plume identification method is described in the work of Jin et al. (2023). Fire centers are identified using the Moderate Resolution Imaging Spectroradiometer (MODIS) Active Fire products and subsequently used as starting points for calculating one-day plume dispersion using the HYSPLIT model with meteorological fields from North American Regional Reanalysis (NARR). Calculations begin at the same time of the day (18 UTC) and if there are no drastic changes in wind, the predicted plume trajectories should reasonably represent the progression from the near to far field of fires. The locations of the fire plumes are matched to GEOS-Chem grids to demonstrate changes in aerosol effects along the plumes. Plume age is determined as the time required for the plume to reach designated smoke-affected areas.

2.3 Box model setup

We employ F0AM (Wolfe et al., 2016) version 4.3 to assess the effectiveness of GEOS-Chem in resolving the aerosol effects on O₃ within fire plumes. We use Master Chemical Mechanism (MCM) version 3.3.1 (Jenkin et al., 2015), which features a near-explicit chemical mechanism with detailed gas-phase chemical processes. Additionally, we incorporate the heterogeneous uptake of HO₂ by aerosols as described in Eq. (1) and assume a monodisperse size distribution for each aerosol type.

We first evaluate whether the aerosol effects resolved in GEOS-Chem are reproducible in F0AM by initializing F0AM with output from GEOS-Chem. The fire plumes are modeled with a pseudo-Lagrangian style in F0AM, where we set the initial chemical concentrations based on GEOS-Chem grids with plume age of one hour and allow them to evolve over the subsequent five hours. Species used to initiate F0AM include CO, O₃, reactive nitrogen species and some VOCs. Meteorological variables and photolysis-relevant parameters are constrained at each model step and held constant during the integration time of one hour. We adopt the F0AM's hybrid method for J-values calculations, which uses TUV-calculated solar spectra but does not include explicit aerosol effects. J-values of HONO and HCHO from GEOS-Chem are applied to scale box model-calculated J-values. CO is an approximately conservative tracer (Robinson et al., 2021); we calculate the first-order dilution rate in F0AM at each model step using the temporal changes in CO concentrations along the fire plumes (Müller et al., 2016), as determined by GEOS-Chem. Configuration details of the F0AM setup are provided in SI Table S2. Chemical species, meteorological and photolysis variables from GEOS-Chem are matched to those in the MCM. To exhibit the aerosol effects on O₃, we run one base



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simulation and two perturbation simulations in F0AM: one eliminating the chemical effect and another removing the radiative impact of fire-related aerosols.

We further assess whether the resolution of GEOS-Chem can resolve the in-plume O₃ chemistry by focusing on fresh plumes in F0AM. Unlike previous setup using GEOS-Chem outputs, here we initiate F0AM with gas phase pollutants and aerosols (primarily organic and black carbon) for various fire types according to the GFED emission factors. We convert these emission factors (g species per kg dry matter burned) to concentrations (ppb for gases and µg m⁻³ for aerosols) using a fixed ratio of biomass burned per cubic meter of air. We then scale all pollutants to achieve aerosol concentrations ranging from 1 to 300 µg m⁻³, allowing us to explore how aerosol effects vary with fire intensity. In this approach, we set only the initial chemical and physical parameters and run the model for one hour, focusing specifically on the characteristics of fresh plumes. Photolysis rates, which we cannot directly constrain in scenarios with and without fires, are estimated based on the relationship between photolysis rate reduction and PM_{2.5} mass as derived from GEOS-Chem (Figure S2). To prevent the build-up of secondary species, we set a one-day lifetime for all species by applying a first-order dilution rate of 1/86400 s⁻¹ and background concentrations at zero.

2.4 Observational data

We analyse the decay of PM_{2.5} and NO₂ within fire plumes using observationally derived datasets. Surface PM_{2.5} data are from Wei et al. (2023), featuring 1 km resolution PM_{2.5} estimates generated through an integration of ground-based measurement, satellite observations and machine learning models. TROPOspheric Monitoring Instrument (TROPOMI) retrievals of NO₂ tropospheric columns are sourced from Jin et al. (2023), which incorporates a priori profiles from GEOS-Chem simulations and explicitly accounts for the smoke aerosols during retrieval. These surface PM_{2.5} and tropospheric NO₂ column data are also used to identify O₃ regimes from observations.

2.5 Photochemical regime identification

We determine the photochemical regimes by assessing the chain termination rates of HO_x radicals, similar to the method described in Ivatt et al. (2022). The radical termination pathways include (1) loss via NO_x as indicated by the reactions $NO_2 + OH = HNO_3$, and $RO_2 + NO \Rightarrow$ alkyl nitrate ($RONO_2$), (2) HO_x self-reactions, and (3) heterogenous uptake of HO_2 by aerosols. A predominance of NO_x as the sink for HO_x characterizes a NO_x -saturated regime. Dominance by HO_x self-reactions indicates a NO_x -limited regime. When the rate of HO_2 uptake to aerosol dominates, it indicates a heterogeneous chemistry-inhibited regime. The radiative effect of aerosols, however, has not been considered in the regime calculations. To address this issue, we account for the aerosol radiative effect on O_3 production by using the difference in total HO_x termination rates between BASE and BASE_NO_RAD simulations (ΔHO_x) as a proxy. Notably, ΔHO_x is not an actual chemical pathway; instead, it serves as an indicator of light availability and its influence on the photochemical activities. If ΔHO_x exceeds any of the aforementioned three pathways, it suggests a light-limited regime. We use the reaction rates output from GEOS-Chem to calculate the chain termination rates and ΔHO_x in each grid box at 20:30 UTC (around 1:30 PM local time) and identify the corresponding regime based on the maximum term. Monthly mean regimes are determined by averaging the magnitudes of four terms rather than counting the occurrences of each regime, to reflect the cumulative influence of these processes over time.



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3. Results and Discussion

3.1 The role of smoke aerosols in O₃ production

We assess the aerosol effects and the overall impact of fires on O₃ in GEOS-Chem in both the near and far field of fires, as depicted in Figure 1. It reveals that for fire pixels with small to large PM enhancements, which represent the majority of fires, fires positively affect O₃ concentrations in both near and far fields, indicating the influence of fires through the emissions of substantial quantities of O₃ precursors outweighs the aerosol effects. Generally, fire pixels with larger PM enhancement are associated with larger increase in O₃ concentrations. In contrast, pixels affected by extreme fires see suppressed O₃ levels in their immediate vicinity, suggesting the aerosol effect overshadows the emission effect. Furthermore, this O₃ suppression is likely driven by the strong aerosol radiative effect associated with dense plumes near the centers of fires. In the near field of the fires, the average radiative impact on O₃ concentrations for extreme fire pixels is about 60 times that observed in the others. Other factors contributing to the decreased O₃ concentrations may be NO_x titration, sequestration of NO_x into peroxyacetyl nitrate (PAN) in the near field of fires (Jaffe and Wigder, 2012). For extreme fires, the O₃ suppression by smoke aerosols may extend to distant areas of the fires, and a modest increase in O₃ levels is observed in the far field (Figure 1).

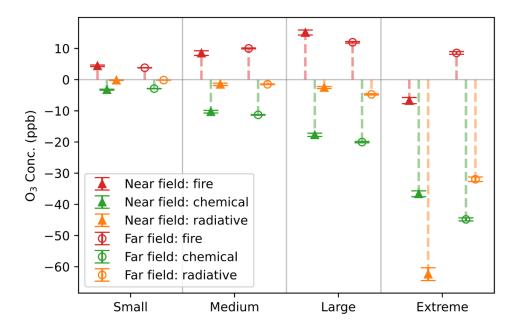


Figure 1. Total fire effects and aerosol chemical and radiative impacts on O₃ resolved in GEOS-Chem, across near and far fields at 20:30 UTC for fire plumes in September 2020. Grid cells with a plume age of 1–3 hours are marked as near field (triangles), and 4–24 hours as far field (circles). To further elucidate the dependence of aerosol impacts on PM, we classify fire pixels into different groups based on the enhancement of PM_{2.5} (ΔPM_{2.5}) at each grid box: small (ΔPM_{2.5} <50 μg m⁻³), medium (50–100 μg m⁻³), large (100–200 μg m⁻³) and extreme (>200 μg m⁻³). The total fire impact, chemical and radiative impacts on O₃ concentrations are



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represented by red, green and orange colors, respectively. Error bars denote standard deviation. The overall fire effect is indicated by the difference in O₃ concentrations between the BASE and NO_FIRE simulations. Calculations of the aerosol effects are provided in the method section.

Both aerosol chemical and radiative effects are shown to decrease O_3 in the fire plumes. For grid cells affected by small to large fires, the aerosol chemical effect outweighs the radiative effect. Contrary to the consistent behaviors observed in both the near-field and far-field regions for these fire pixels, those experiencing extreme PM enhancement exhibit significant variations. In the proximal areas of fire origins, the radiative effect on O_3 concentrations is much higher than the heterogeneous chemical effect for these extreme fire pixels. Yet, this radiative effect represents a temporary suppression of O_3 production, with its influence decaying rapidly—on average, the effect on O_3 concentrations diminishes by about half within five hours. Moving further from the fire centers, the chemical effect starts to dominate over the radiative effect on O_3 . The aerosol impacts on O_3 concentrations, through both chemical and radiative pathways, tend to intensify as $\Delta PM_{2.5}$ increases. The aerosol effects on O_3 concentrations mirror those on O_3 net production (SI Figure S3). However, a notable difference exists when comparing large and extreme fire pixels. In extreme fire pixels, the aerosol chemical effect on O_3 production rate is weaker than in large fire pixels (Fig. S3), likely due to lower HO_x levels within dense plumes. Nevertheless, the chemical effect on O_3 concentrations results in a stronger overall reduction in extreme fire pixels (Fig. 1), possibly because O_3 suppression in surrounding areas is transported into these regions. Overall, aerosol effects resolved in GEOS-Chem highlight the significant heterogeneous chemical influence on O_3 for fires and an exceptionally critical radiative effect for extreme fires.

3.2 Comparison between GEOS-Chem and F0AM

We first use F0AM to conduct similar experiments with GEOS-Chem output for fire plumes of different scales as shown in Figure S4. We find that the overall fire impacts on O₃ concentrations and the aerosol chemical and radiative effects simulated in F0AM exhibit good agreement with those resolved in GEOS-Chem across fire plumes of different scales. Although F0AM does not explicitly account for atmospheric processes such as vertical mixing, turbulent diffusion, dry and wet deposition, these factors appear to have a negligible impact (beyond their representation as dilution) on the several-hour time scale examined here. The comparison suggests that chemistry, and to a lesser extent dilution, are the leading factors explaining most variations in aerosol effects.

Our results indicate relatively consistent aerosol effects resolved by different numerical simulation schemes. GEOS-Chem is a global Eulerian model, which solves continuity equations on a geographically fixed frame of reference (Liu et al., 2023; Long et al., 2015), whereas in F0AM plumes are simulated in a pseudo-Lagrangian approach that follows the movement of air parcels. However, the Eulerian model struggles with an unrealistic dilution of small plumes. In our comparison, the initial chemical concentrations used in F0AM are adopted from GEOS-Chem where dilution of initial subgrid plumes has occurred. Consequently, although both GEOS-Chem and F0AM exhibit comparable results, the near-field behavior of subgrid plumes may not be accurately solved by either model.

Next, instead of initiating F0AM using GEOS-Chem simulations, we explore the aerosol influence on O₃ in fresh plumes by initiating F0AM with emission data from GFED. Our analysis reveals that the aerosol influence on O₃ depends on PM mass concentrations (Figure 2), which is consistent with findings from GEOS-Chem. Furthermore, at the same PM enhancement, the influence of aerosol chemical and radiative pathways on O₃ concentrations appears



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to vary distinctly among various fuel types, suggesting underlying factors beyond PM concentrations play a role in controlling aerosol influence. PM enhancement thresholds where the radiative effect outweighs the chemical effect vary by fuel type, being highest for boreal forest fires, followed by peat and temperate forest, and lowest in deforested/tropical forest, agricultural waste and savanna.

As we control the PM magnitude, the various patterns across fuel types are due to variations in emission factors of O₃ precursors, NO_x in particular. According to GFED, emissions from the boreal forest fires exhibit the highest PM to NO_x ratio, followed by those from peat, temperate forest and tropical forest fires. The lowest ratios are observed in agricultural waste and savanna burning. These results highlight that the aerosol influence on O₃ is not only dependent on the abundance of PM but also modulated by NO_x concentrations. Higher NO_x levels can suppress the chemical effect of aerosols by altering HO_x loss pathways; under high-NO_x conditions, more HO_x is consumed by reactions with NO_x, leaving less HO_x for heterogeneous uptake by aerosols. On the other hand, larger PM concentrations enhance HO_x loss through aerosol uptake. The interplay between these two factors largely accounts for the variations in aerosol impacts on O₃ within fire plumes.

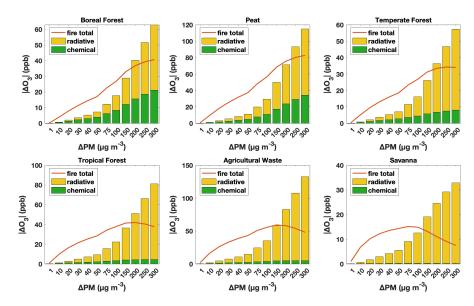


Figure 2. The impact of aerosol chemical and radiative pathways on O₃ concentrations in response to intensified fires, as indicated by increasing PM enhancement, for various fuel types in the GFED emission inventory. Different panels demonstrate aerosol effects for the burning of boreal forest, peat, temperate forest, deforested/tropical forest, agricultural waste and savanna. Orange lines denote overall O₃ enhancement due to fires, and green and yellow bars denote decreases in O₃ concentrations attributable to the aerosol heterogeneous chemical and radiative pathways.

Although the dependence of aerosol effects on NO_x is also seen in GEOS-Chem, Figure 1 indicates for PM enhancement less than 200 μg m⁻³, aerosol chemical effect tends to outweigh the radiative effect. It is likely that GEOS-Chem does not accurately resolve the aerosol effects on O_3 for the subgrid-scale young plumes. But for plumes that are not in the immediate vicinity of the fire source, where mixing with background air has occurred, or in the case of large-scale fires that exceed the size of a grid cell, GEOS-Chem should be capable of resolving the aerosol impacts.

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Additionally, for the range of PM enhancement examined here (within 300 μg m⁻³), F0AM suggests that fire generally has a positive impact on O₃ concentrations, aligning with our findings from GEOS-Chem.

Observations of PM_{2.5} and NO₂ within fire plumes reveal that concentrations of NO₂ column decay more rapidly than PM_{2.5} (Fig. 3), with an even steeper decline expected for surface NO₂. This observational finding implies that as plumes age, the aerosol heterogeneous chemical effect becomes increasingly important, as reflected by the higher PM to NO₂ ratio in the far field compared to near sources. This also accounts for why, in GEOS-Chem simulations, the chemical effect tends to outweigh the radiative effect away from fire origins. By integrating GEOS-Chem and box model with observational constraints, our study provides a detailed and comprehensive depiction of aerosol effects within fire plumes and the potential underlying mechanisms.

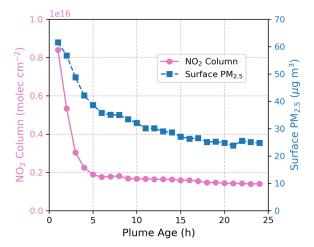


Figure 3. Decay of NO₂ column (pink) and surface PM_{2.5} (blue) within fire plumes. Surface PM_{2.5} data are from Wei et al. (2023) and TROPOMI NO₂ tropospheric columns are from Jin et al. (2023).

To summarize, for most fires, there is generally a net positive effect on O_3 concentrations. Near the source, either heterogeneous chemical or radiative effects may dominate depending on NO_x levels. In the case of temperate forest fires, even small plumes could exhibit a more pronounced aerosol radiative effect than the chemical effect in the near field. As the plumes age, NO_x is rapidly consumed in the plumes, and the aerosol chemical effect tends to be increasingly important. In contrast, extremely large fires are dominated by the aerosol radiative effect, leading to an overall suppression of O_3 in the near field that can extend further from the fire sources. Even for these fires, the radiative effect diminishes rapidly with dilution and is eventually surpassed by the chemical effect downwind.

The importance of aerosol effects on O₃, especially the heterogeneous chemical effect, has been a subject of significant debate. Xu et al. (2021) found that the conceptual model based on gas phase chemistry adequately explains the O₃ chemistry in western US wildfire plumes (R² of 0.64) and thus aerosol heterogeneous chemical processes are likely minor. Conversely, Li et al. (2019) and Ivatt et al. (2022) highlighted a significant role of the heterogeneous chemical effect on the near-surface O₃ formation in eastern China and the Indo-Gangetic Plain during the mid-2010s. Even among studies that supported the importance of the aerosol chemical effect, some emphasized its significance



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in environments with high aerosol loadings, while others pointed to its relevance in clean suburban areas (Li et al., 2022; Xue et al., 2014).

Our findings reconcile seemingly contradictory studies by showing that the aerosol effects on O₃ are determined by both aerosol loading and NO_x concentrations. The study by Xu et al. (2021) focused on relatively fresh plumes, which are usually associated with high NO_x concentrations, where the inhibitive effects of smoke aerosols may be secondary. However, as plumes age and both NO_x and PM concentrations decay, the longer-lived accumulation mode aerosols (lifetime of 5–7 days, compared to hours to a day for NO_x) (Jin et al., 2021; Seinfeld and Pandis, 2016) can become more influential in O₃ production. The shift in the relative importance of aerosols vs. NO_x may differ in urban/suburban settings, where PM and NO_x can originate from different sources and possibly lead to more varied concentration patterns. O₃ production can be significantly impacted by heterogeneous chemistry in conditions ranging from heavily polluted areas with high aerosol loadings to cleaner areas with moderate aerosol loadings but low NO_x.

3.3 Prevalence of aerosol-dominated regimes during the 2020 California fire season

Our findings emphasize that both the heterogeneous chemical and radiative effects can significantly influence O₃ production depending on fire conditions. Driven by these insights, we propose a novel O₃ production regime – termed the "light-limited regime", which is identified through a sensitivity test in which the radiative effect is turned off and the resulting reduction in HO_x availability outweighs any of the three termination pathways. SI Figure S5 illustrates the O₃ production regime over California from July to December under a no biomass burning scenario. In the absence of fire impacts, most of the areas are in NO_x-limited regimes during the summertime, with a NO_x-saturated regime in urban cores of Los Angeles and San Francisco. During the cooler months, a large number of regions shift to a VOC-limited regime.

Accounting for the impacts of fires on O₃ reveals significant changes in the O₃ production regimes during the fire season, as shown in Figure 4 (and Figure S6). Details about significant fire events and emissions during the 2020 wildfire season in California are summarized in SI Text S1. It is evident that numerous areas transition to either the heterogeneous chemistry-inhibited regime or the light-limited regime, which we collectively term as "aerosoldominated regimes".

From August to October, the monthly mean proportions of grid boxes in California entering the aerosol-dominated regimes were 8.9%, 75%, and 43%, respectively (Figure 4). Specifically, 8%, 60% and 41% corresponded to the heterogeneous chemistry-inhibited regime, and 0.9%, 15%, and 1.7% were classified as light-limited regime. The impact of fires on these regimes was minimal for November, when most wildfires were contained. Furthermore, the episodic nature of wildfires caused large daily variations of the O_3 production regime; the heterogeneous chemistry-inhibited regime had an average \pm standard deviation of $19 \pm 13\%$, $48 \pm 16\%$ and $33 \pm 24\%$ for the periods of August 16–August 31, September and October, respectively. Similarly, the light-limited regime showed $1.6 \pm 1.4\%$, $13 \pm 9.6\%$ and $3.2 \pm 5.9\%$ for the same periods.



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Figure 4. Monthly-mean GEOS-Chem derived O₃ photochemical regimes at 20:30 UTC (corresponding to 13:30 local time during daylight saving and 12:30 otherwise) over California, from July to December, when fires are accounted.

The newly defined light-limited regime extensively reflects the central areas of megafires. The August Complex, SCU Lightning Complex, Creek, LNU Lightning Complex, and North Complex ranked the top five fires by burned areas in 2020 (CAL FIRE, 2020b). Notably, during September, the August Complex, Creek and North Complex fires peaked, leading to extensive areas falling under the light-limited regime due to these large-scale wildfires, with the peripheral zones exhibiting heterogeneous chemistry-inhibited regime (Figure 4). The period from September 8 to 10, during the fire season, experienced the most extensive coverage of the light-limited regime across the state (32–42%, SI Figure S7), coinciding with significant wildfire events. Notably, despite the exceptionally large scale of the SCU and LNU Lightning Complex fires, their impacts on the light-limited regime were much less pronounced compared to the other three fires based on both daily and monthly average. A NO_x-saturated regime was predominant under the impact of these two wildfires. We attribute the difference in regimes to the distinct environments where fires occurred. Contrary to the fires in forest areas, the SCU and LNU fires occurred in the Bay area, an urban center characterized by significant higher background levels of NO_x. Elevated NO_x concentrations enhance HO_x termination through reactions with NO_x, necessitating higher aerosol concentrations for the light effect term to surpass this termination pathway. The observed reduction in the light-limited regime under high NO_x conditions further corroborates our earlier findings on the interactions among aerosol effects, PM and NO_x.

3.4 Uncertainties in O₃ regime classification

The regime calculations derived from modeling are subject to uncertainties, primarily associated with the HO₂ uptake coefficient (γ_{HO_2}) and fire emission inventory. Due to the challenges of directly observing or constraining the aerosol heterogeneous uptake through measurements, we rely on model simulations to estimate the chemical effect. Consequently, the results are influenced by the γ_{HO_2} values used in the analysis, a parameter that varies with aerosol types and relative humidity. Organics constitute a major fraction of biomass burning aerosols. Laboratory studies measuring the uptake coefficient from single-component organics have reported values of 0.007–0.09 for humic acid (Lakey et al., 2015), <0.01–0.13 for levoglucosan (Taketani et al., 2010) and 0.02–0.18 for dicarboxylic acids (Taketani et al., 2013), across a variety of relative humidity levels. In comparison, field studies generally report higher values (0.08–0.40) (Taketani et al., 2012; Zhou et al., 2020), likely due to the presence of copper and iron ions in the



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particles that are known to enhance HO_2 uptake (Mao et al., 2013). To our knowledge, no studies have specifically measured γ_{HO_2} for biomass burning aerosols in field settings, but Taketani et al. (2012) reported values of 0.2–0.37 for samples strongly affected by biomass burning. To assess the impact of γ_{HO_2} on our results, we conduct sensitivity tests using γ_{HO_2} of 0.1 for a one-month simulation during September. Under this reduced value, the spatial pattern of photochemical regimes remains largely unchanged (SI Figure S8). Future research measuring γ_{HO_2} for smoke aerosols is needed to better constrain this parameter.

Furthermore, we evaluate GEOS-Chem simulations of $PM_{2.5}$ with ground-based measurements from EPA's AQS. We find that GEOS-Chem tends to overestimate $PM_{2.5}$, simulating 2020 daily average $PM_{2.5}$ levels at 24 ± 23 µg m⁻³, compared to 12 ± 5.5 µg m⁻³ from ground-based observations. During the fire season, modeled $PM_{2.5}$ concentrations are about 1.2, 4.1 and 2.4 times higher than the ground observations in August, September and October, respectively. The overestimates of $PM_{2.5}$ is likely driven by overestimated fire emissions in GFED (Qiu et al., 2024). These comparisons, however, are limited by factors such as the sparse ground observations (~72 sites for $PM_{2.5}$), the potential unrepresentativeness of a single site for the coarse grid in GEOS-Chem, and the GEOS-Chem modeled decay of PM further from the fires. To assess the potential impacts of model overestimates on our analysis, we perform additional regime calculations by adjusting the monthly biomass burning emissions based on the model—observation comparisons (Figure S9). Even with significantly reduced emissions, aerosol-dominated regimes still accounted for about 7%, 54% and 17% of the total area in August, September and October, respectively. Notably, aerosol-dominated regimes remain dominant in September during the 2020 fire season.

3.5 What is the PM_{2.5} threshold for reaching aerosol-dominated regimes?

Recognizing that the regime classification discussed above may be affected by model inputs and performance, we further explore how these model-based findings can be applied to observational data, with a primary focus on identifying aerosol-dominated regimes. We first investigate whether $PM_{2.5}$ as an indicator of aerosol concentrations can be used to identify the regime shift. Fig 5 (a) shows the average fractional contribution of each HO_x termination pathway at various $PM_{2.5}$ levels. As PM levels increase, HO_x loss via self-reaction declines, while aerosol heterogeneous uptake and photolysis reduction effects become increasingly dominant. Fig 5 (b) exhibits the probability of each regime at various $PM_{2.5}$ levels. Low $PM_{2.5}$ levels are usually associated with a NO_x -limited regime. The heterogeneous chemistry-inhibited regime is more likely to occur as $PM_{2.5}$ levels increase until the light-limited regime overshadows it at extremely high $PM_{2.5}$ concentrations. At $PM_{2.5}$ concentration of 30 μ g m⁻³, O_3 production already transitions to the heterogeneous chemistry-inhibited regime in most areas under the impact of fires. A significantly higher $PM_{2.5}$ concentration (~500 μ g m⁻³) is required to enter the light-limited regime. We observe a similar pattern of HO_x losses and regime shifts when reducing the γ_{HO_2} value to 0.1, as shown in SI Figure S10. In this calculation, the $PM_{2.5}$ threshold for shifting to a heterogeneous chemistry-inhibited regime increases slightly from 30 to 40 μ g m⁻³.



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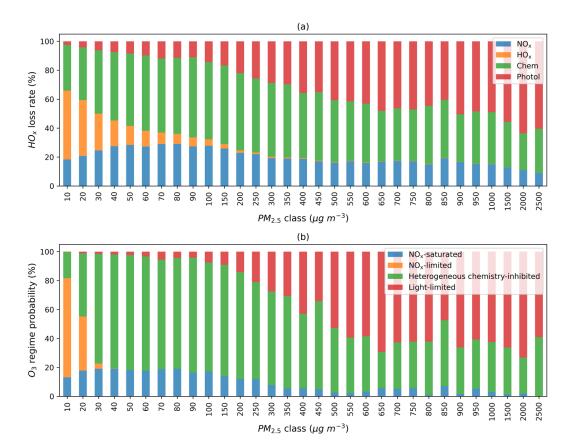


Figure 5. (a) The average fractional contribution of the four HO_x termination terms to the total. (b) The probability distribution of grid boxes across different regimes, at various $PM_{2.5}$ levels. This figure includes all fire-affected grid boxes at 20:30 UTC during 2020, with a selection criterion of $\Delta PM_{2.5} > 10~\mu g~m^3$. The $PM_{2.5}$ class denotes rounded total $PM_{2.5}$ concentrations.

Further investigations uncover that the PM_{2.5} threshold required for most grid boxes to transition to a heterogeneous chemistry-inhibited regime is highly dependent on NO_x concentrations (Figure 6 (a)). Here we categorize NO_x concentrations into four classes: 0–1, 1–10, 10–25 and >25 ppb, and the PM_{2.5} thresholds likely to induce aerosol-dominated regimes are approximately 18, 25, 185 and 320 μg m⁻³, correspondingly. We primarily focus on fire plumes in this study, but grid boxes not affected by fires appear to exhibit similar trends in the probability of aerosol-dominated regimes. These results support our earlier findings that in scenarios with high NO_x concentrations, more PM is needed to attain a comparable level of aerosol contribution as observed in low NO_x scenarios. Because surface PM_{2.5} and NO₂ column can be derived from ground-based or satellite observations, we explore how their ratio can be used to imply aerosol-dominated regimes. Figure 6 (b) illustrates the relationship between the probability of aerosol-dominated regimes and the surface PM_{2.5} to tropospheric NO₂ column ratio. When the ratio (PM_{2.5}/NO₂) reaches about 20 (μg m⁻³)/(10¹⁵ molecules cm⁻²), the aerosol-dominated regimes are likely to prevail, and will consistently be dominant at higher ratios.



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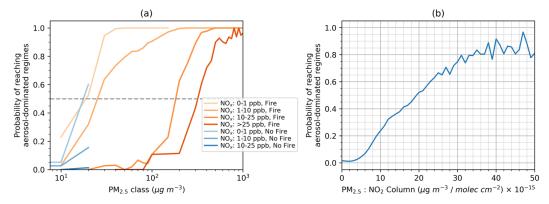


Figure 6. (a) Probability of achieving aerosol-dominated regimes in response to varying $PM_{2.5}$ and NO_x concentrations, differentiated by fire-impacted (orange) and non-fire (blue) grid boxes. The dashed line marks the thresholds where half of the grid boxes enter aerosol-dominated regimes. (b) Relationship between the surface $PM_{2.5}$ to NO_2 column ratio and the probability of reaching aerosol-dominated regimes, combining both fire-impacted and non-fire grid boxes.

We therefore adopt a threshold of 20 (µg m³)/(10¹5 molecules cm²) for PM2.5/NO2 identifying aerosol-dominated regimes and apply it to satellite-derived surface PM2.5 and tropospheric NO2 column data. The resulting aerosol-dominated regimes are highlighted in red in Fig. 7. Overall, the observation-based aerosol-dominated regimes in Fig. 7 align well with the model-based calcification in Fig. 4. Both methods reveal similar spatial distributions: aerosol-dominated regimes were widespread in September, peaked in the northern and central region in October, but exhibited relatively larger discrepancies in August. Spatially, the observation-based method estimates that approximately 20%, 47% and 16% of the state fell within aerosol-dominated regimes from August to October; these values are larger than the model estimates for August but somewhat smaller for September. Despite these differences, the general agreement between the two regime classifications underscores the significant role of aerosols in surface O₃ photochemistry under wildfire conditions. This analysis also highlights the utility of satellite-derived PM2.5 to NO₂ ratio for pinpointing aerosol-dominated regimes. We note that the threshold value suggested here warrants further investigation. Although the comparison of fire and urban plumes is beyond the scope of this study, it is worth noting that fire and urban plumes may differ substantially in emissions, aerosol composition and thus the O₃ chemistry. Future research is therefore warranted to refine this threshold and incorporate more sophisticated representations of these differences.

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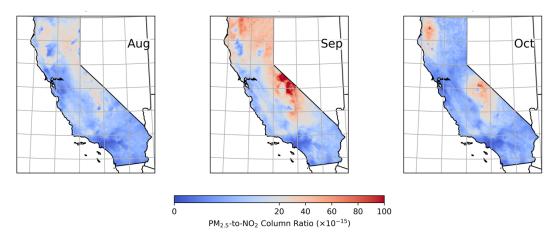


Figure 7. Monthly mean O_3 photochemical regimes identified using the surface $PM_{2.5}$ to TROPOMI NO_2 column ratio over California from August to October. Red colors represent aerosol-dominated regimes, while blue colors indicate NO_3 -limited or NO_3 -saturated regimes. Monthly mean $PM_{2.5}$ and NO_2 are used to calculate the ratio, with a threshold of 20 (μ g m⁻³)/(10^{15} molecules cm⁻²) applied to identify aerosol-dominated regimes.

4. Conclusion

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Aerosols typically suppress surface O₃ formation through heterogeneous uptake of HO₂ and the reduction of photolysis rates, yet both pathways are difficult to observe or measure directly. Here, we combine GEOS-Chem, F0AM box model and observational constraints to examine aerosol effects on O₃ formation. We found that for most fires, O₃ concentrations increase because emissions of O₃ precursors outweigh aerosol effects. In contrast, during extreme large fires, the strong radiative effect may lead to an O₃ suppression near the fire sources. As plumes age, the aerosol chemical effect becomes more pronounced. To represent these effects, we introduce the aerosol heterogenous chemistry-inhibited and light-limited regimes into GEOS-Chem. Our results suggest that aerosol-dominated regimes played a significant role during the 2020 wildfire season in California.

Aerosol loading and NO_x levels are the key factors governing aerosol effects on near-surface O₃ formation. Under NO_x-saturated and aerosol-dominated regimes, O₃ chemistry becomes HO_x-limited. Higher NO_x reduces aerosol effects by driving more HO_x to react with NO_x. These results imply that even at similar aerosol concentrations, fire and urban plumes are likely to experience different levels of aerosol effects and fall in distinct photochemical regimes. Within wildfires, areas are apt to achieve the heterogeneous chemistry-inhibited regime when PM_{2.5} concentrations approach tens of μg m⁻³. However, the typically high NO_x concentrations in urban areas may preclude the emergence of aerosol-dominated regimes in these regions. These insights have significant implications for O₃ pollution in downwind urban areas. Previous studies have pointed out that VOC-rich wildfire plumes can enhance O₃ pollution when they mix into high-NO_x urban plumes (Jin et al., 2023; Xu et al., 2021). This study, however, unveils an additional, hidden downside of urban high NO_x: it obscures aerosol effects that would otherwise help reduce O₃, thereby exacerbating O₃ pollution relative to scenarios where wildfire smoke penetrates rural or suburban areas. It



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suggests that reducing NO_x concentrations in urban downwind areas could yield further benefits for mitigating O_3 pollution under fire conditions.

In addition to the diagnostic modeling approach for identifying aerosol-dominated regimes, we propose using the surface PM_{2.5} to NO₂ column ratio as an indicator. When combined with the widely used HCHO to NO₂ ratio (FNR) for identifying NO_x-limited or NO_x-saturated regimes with satellite remote sensing (Itahashi et al., 2022; Jin et al., 2020; Souri et al., 2020), this enables a comprehensive identification of O₃ regimes on a global scale using observation-based NO₂, HCHO and PM_{2.5}. However, challenges remain for identifying O₃ regimes under wildfire conditions due to retrieval uncertainties in thick smoke plumes and significant primary HCHO emissions that may compromise its effectiveness as an indicator of VOC reactivity (Liao et al., 2021). More work is needed to evaluate the reliability of FNR thresholds in wildfire plumes and to refine PM_{2.5} to NO₂ thresholds under diverse environmental settings to improve our ability to characterize photochemical regimes.

Data Availability

The data and scripts for the regime classification in this study are openly available at https://github.com/Jiaqi-Shen/Shen et al fire chemistry manuscript.

485 Competing interests

The contact author has declared that none of the authors has any competing interests.

Author Contributions

J.S.: Methodology, Formal Analysis, Data Curation, Visualization, Writing - Original Draft. R.C.C.:
 Conceptualization, Funding Acquisition, Writing - Review & Editing. G.M.W.: Methodology, Writing - Review & Editing. X.J.: Conceptualization, Methodology, Funding Acquisition, Writing - Review & Editing. All authors have given approval to the final version of the manuscript.

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