



Understanding mechanisms of pyridine oxidation with ozone addition via reactive force field molecular dynamics simulations

Zhongze Bai^a, Xi Zhuo Jiang^{b,*}, Kai H. Luo^{a,*}

^a Department of Mechanical Engineering, University College London, Torrington Place, London WC1E 7JE, UK

^b School of Mechanical Engineering and Automation, Northeastern University, Shenyang, Liaoning 110819, PR China

HIGHLIGHTS

- The first ReaxFF MD study on the influence of ozone on pyridine combustion.
- Revealing reaction pathways for pyridine combustion with and without ozone.
- Explaining how ozone affects pyridine combustion products at the atomic level.

ARTICLE INFO

Article history:

Received 27 June 2022

Received in revised form 13 September 2022

Accepted 6 November 2022

Available online 11 November 2022

Keywords:

Pyridine oxidation

Ozone assisted combustion

Reactive force field

Molecular dynamics

NOx

ABSTRACT

Ozone assisted combustion is a promising method to control combustion, ignition and pollutant formation. In this study, we investigated the ozone behaviours in fuel-NOx control through reactive force field (ReaxFF) molecular dynamics (MD) simulations of pyridine (a main nitrogen-containing compound in coal) oxidation under different ozone concentrations. The results show that ozone enhances the pyridine combustion process and facilitates the conversion of CO to CO₂ and NO to NO₂. Ozone participates in the reactions with intermediates and promotes the generation of active particles like OH, HO₂, HO₃ and H₂O₂. This research reveals mechanisms, at the atomic level, for the effects of main products formation during pyridine oxidation under different levels of ozone addition. The present study provides the scientific base for the control of NOx emissions through ozone assisted combustion technology.

© 2022 The Author(s). Published by Elsevier Ltd. This is an open access article under the CC BY license (<http://creativecommons.org/licenses/by/4.0/>).

1. Introduction

The nitrogen oxides (NOx) emissions from the coal combustion cause serious environmental problems (Bowman, 1992), and thus modern control technologies for combustion are desired to reduce nitrogenous pollutants. The NOx emissions from combustion processes are mostly nitric oxide (NO) with smaller amounts of nitrogen dioxide (NO₂) (Glarborg et al., 2003). NO₂ can be easily removed by water due to its high solubility (Mok and Lee, 2006). By contrast, due to its low solubility, NO in exhaust gases has to be removed by selective catalytic reduction (SCR) with high operation costs (Mok and Lee, 2006). Ozone (O₃), one of the strongest oxidizers, has the ability to improve combustion performance (such as ignition, flame propagation and flame stabilization) and influence the conversion from NO to NO₂ by modifying fuel oxidation pathways (Sun et al., 2019). Thus, O₃ addition can be a feasible

and promising method to control NOx emissions from coal combustion.

There are numerous studies focusing on the influence of O₃ on ignition (Yamada et al., 2005; Foucher et al., 2013), flame propagation (Gao et al., 2015; Gluckstein et al., 1955) and flame stabilization (Zhang et al., 2016; Weng et al., 2015) in fuel combustion. Tachibana and co-workers carried out experiments to explore the effects of O₃ on combustion of compression ignition engines (Tachibana et al., 1991). Results indicate that O₃ can decrease CO, C_nH_m, and soot, but increase NOx emissions. The same conclusion is also drawn by Nasser and co-workers when they investigated the O₃ influence on the combustion characteristics of internal combustion engines (Nasser et al., 1998). Previous studies have demonstrated O₃ addition can change the exhaust emissions from fuel combustion effectively. However, the effects of O₃ addition on emissions of pollutants from fuel combustion are less explored. There are also some unsolved fundamental questions. For instance, the underlying mechanisms of O₃ influence on NOx formation from combustion are still unclear. Moreover, the composition of NOx

* Corresponding authors.

E-mail addresses: jiangxz@mail.neu.edu.cn (X.Z. Jiang), k.luo@ucl.ac.uk (K.H. Luo).

emissions under varying O₃ concentrations was not investigated in above research, which would affect the operating costs in the NO_x reduction process.

The underlying mechanisms are difficult to be determined by current experimental techniques due to the difficulty in obtaining all the intermediates (Liu and Guo, 2017). Atomistic computational simulations can reveal the reaction mechanism at the molecular level and obtain reaction information that cannot be obtained by experimental measurement. The main atomistic simulation methods include quantum mechanics (QM) and molecular dynamics (MD). QM methods can simulate chemical reactions accurately. However, the simulated system is usually smaller than 100 atoms as QM is computationally expensive to simulate large systems (Feng et al., 2019; Jiang and Luo, 2021; Jiang et al., 2019). Classical MD methods can simulate large-scale systems of constitutive atoms/molecules (Jiang et al., 2020), but they are not amenable to chemical reactions. The reactive force field molecular dynamics (ReaxFF MD) simulation combines the capability of QM and affordable computational cost of classical MD methods, which can be used to simulate the chemical reaction process of complex systems. In the combustion of coal, nitrogen oxides mainly come from the oxidation of nitrogen-containing compounds with pyridinic and pyrrolic structures (Glarborg et al., 2003). The major forms of nitrogen groups in coal are pyrrolic-N (N-5) of 50–80 % and pyridinic-N (N-6) of 20–40 % (Zhang et al., 2021). According to a previous study (Axworthy et al., 1978), pyridine and pyrrole share similar NO_x formation mechanisms, and pyridine (C₅H₅N) - the main nitrogen-containing compound in coal (Solomon and Colket, 1978; Nelson et al., 1991; Bai et al., 2021) - is chosen as the target molecule during our ReaxFF MD simulations in this study.

The aim of this study is to investigate the effects of O₃ on the emissions of pollutants from C₅H₅N oxidation via a series of ReaxFF MD simulations. Firstly, time evolutions of main reactants are studied. Then, the effects of O₃ on the yields of the reactions are explored. Finally, the elementary reactions generating principal products are revealed during C₅H₅N oxidation under varying O₃ concentrations.

2. Methods

The ReaxFF MD is originally developed by van Duin and co-workers (Van Duin et al., 2001), which employs a bond-order formalism in conjunction with polarizable charge descriptions to determine both reactive and non-reactive interactions between atoms (Senftle et al., 2016). The energy function in the ReaxFF force field is shown in Eq. (1):

$$E_{\text{system}} = E_{\text{bond}} + E_{\text{over}} + E_{\text{angle}} + E_{\text{tors}} + E_{\text{vdW}} + E_{\text{Coulomb}} + E_{\text{specific}} \quad (1)$$

More details of the ReaxFF formalism and development are shown in (Senftle et al., 2016).

All the ReaxFF MD simulations are carried out using the REAXC package in the Large-scale Atomic/Molecular Massively Parallel Simulator (LAMMPS) platform (Thompson et al., 2022), with the C/H/O/N force field (Zhang et al., 2009; Zhang et al., 2009). To investigate the O₃ addition on C₅H₅N combustion, seven periodic systems with different numbers of O₃ ranging from 0 to 240 are built with a density of 0.3 g/cm³. To facilitate analysis, the ratio of the number of O₃ molecules, $n(\text{O}_3)$, to the number of C₅H₅N molecules, $n(\text{C}_5\text{H}_5\text{N})$, is defined as α . The numbers of C₅H₅N and O₂ are 80 and 540 in all systems, respectively. The details of all cases are shown in Table 1. The data of case 1 are shared with our previous work (Bai et al., 2023). A typical initial configuration for the simulated system is illustrated in Fig. 1.

Table 1
Details of simulation systems.

NO.	Number of molecules	α	Box length (Å)
1	80C ₅ H ₅ N/540O ₂ /0O ₃	0	50.7446
2	80C ₅ H ₅ N/540O ₂ /40O ₃	0.5	52.0846
3	80C ₅ H ₅ N/540O ₂ /80O ₃	1	53.3589
4	80C ₅ H ₅ N/540O ₂ /120O ₃	1.5	54.5751
5	80C ₅ H ₅ N/540O ₂ /160O ₃	2	55.7394
6	80C ₅ H ₅ N/540O ₂ /200O ₃	2.5	56.8569
7	80C ₅ H ₅ N/540O ₂ /240O ₃	3	57.9322

The canonical (NVT) ensemble is used for all the MD simulations. The time step and bond order cutoff are 0.1 fs and 0.3, respectively. Before the reactive simulations, each system undergoes energy minimization and equilibration at 500 K for 100 ps to optimize the initial geometric configuration. Then, the system temperature increases to 2600 K (with a heating rate of 10 K/ps) and the temperature is kept constant at 2600 K. The physical time of reaction is 1000 ps for every individual simulation.

In data analysis, the reaction pathways are obtained by Chemical Trajectory Analyzer (ChemTraYzer) scripts (Döntgen et al., 2015). The visualizations are produced by Visual Molecular Dynamics (VMD) (Humphrey et al., 1996). The net flux (NF) is the number difference between the forward reaction and the number of the reverse reaction (Arvelos and Hori, 2020). The data in this study are the average results of the three replica simulations. Error bars in all figures are Standard Error (SE) of three replicas.

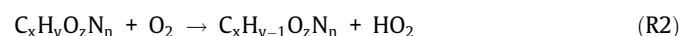
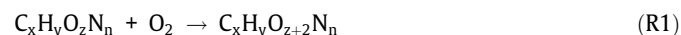
3. Results

3.1. Time evolution of reactants

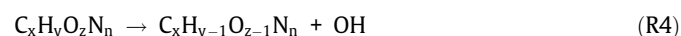
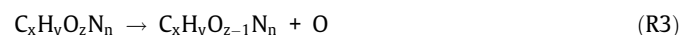
Fig. 2 shows the time evolution of main reactants with α ranging from 0.5 to 3. The comparison of Fig. 2a and 2b illustrates that the reaction rate of C₅H₅N increases as the number of O₃ additives rises, which demonstrates that O₃ can enhance the combustion process. According to Fig. 2c, the number of O₂ decreases all the way in the O₃-free case; by contrast, in the O₃ cases, the number of O₂ first reaches a peak and then declines. The peak amount of O₂ also rises with α values. Fig. 2d shows that O₃ molecules are completely consumed at the first 100 ps. Fig. 2c and 2d suggest that O₃ related reactions may account for the increase of O₂ amount at the initial stage. To further confirm such a conclusion, more details of reaction mechanisms of O₃ are needed, as shown in the subsequent section.

3.2. Reaction mechanisms of O₂ and O₃

To further explain O₃ influence on the consumption rates of main reactants, reaction mechanisms of O₂ and O₃ are investigated in this section. O₂ molecules react with intermediates forming oxygen-containing species and HO₂ via R1 and R2, respectively.



The oxygen-containing species can also decompose by subtracting O and OH radicals:



O₂ molecules react with H and OH radicals forming HO₂ and HO₃ via reactions:

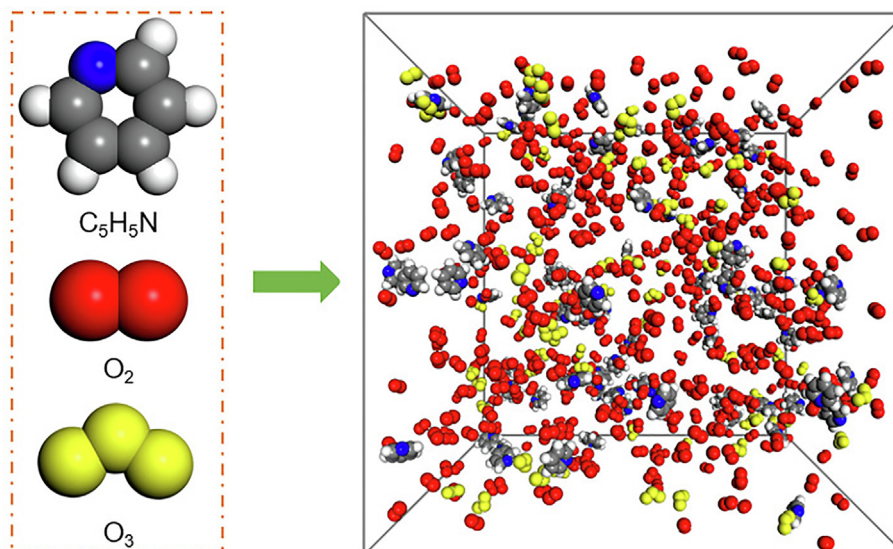


Fig. 1. Initial configuration of $C_5H_5N/O_2/O_3$ system. Yellow: O_3 molecules. Red: O_2 molecules. Dark grey: C atom. Light grey: H atom. Blue: N atom.

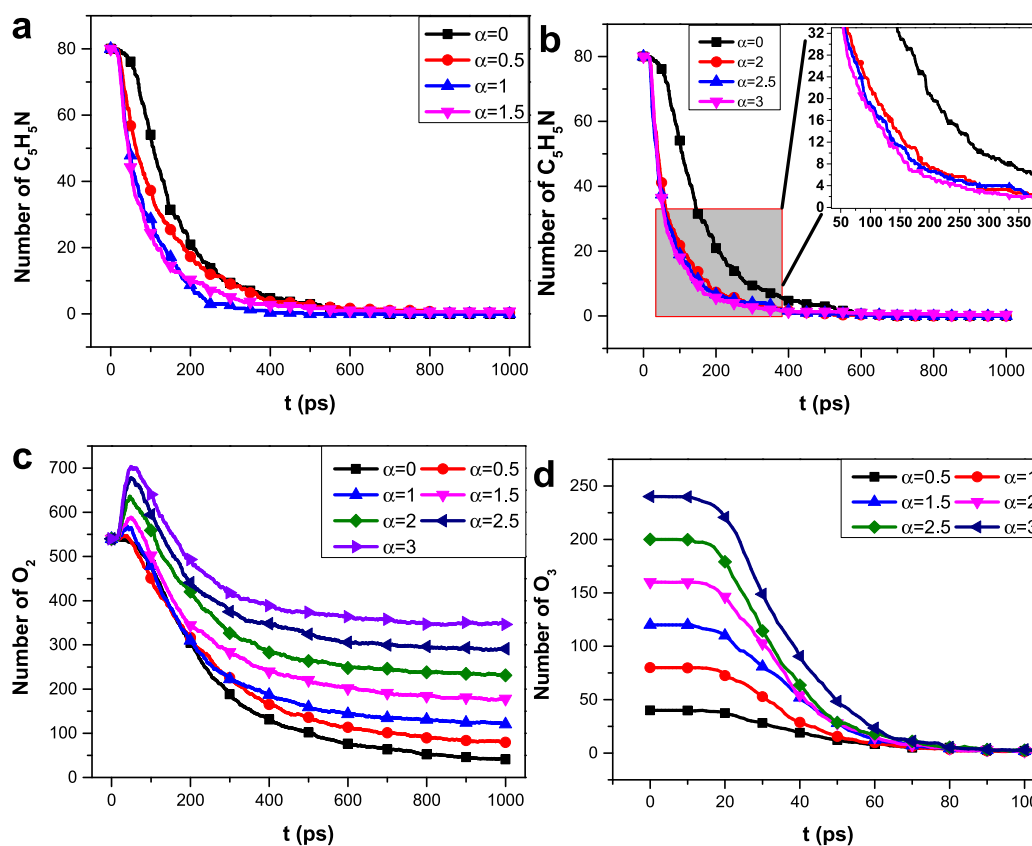
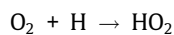
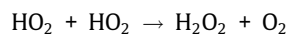
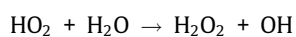


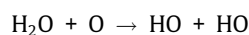
Fig. 2. Time evolution of main reactants. (a) C_5H_5N ($\alpha = 0-1.5$); (b) C_5H_5N ($\alpha = 0&2-3$); (c) O_2 ; (d) O_3 .



H_2O_2 is produced through reactions of HO_2 between H_2O and HO_2 , as shown in R7 and R8:



As for OH radicals, besides R4 and R7, the reaction of H_2O and O and the decomposition of H_2O_2 both contribute to the generation of OH radicals.

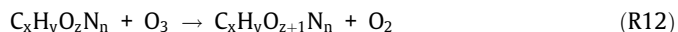




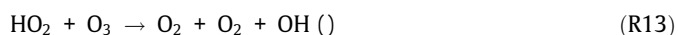
The active radicals (OH, HO₂, HO₃ and H₂O₂) originated from O₂ will finally participate in the reactions that form key products, like CO, CO₂, NO, NO₂ and N₂. In the C₅H₅N combustion with O₃ addition, the O₃ related reactions include three parts: thermal decomposition, reactions with hydrocarbons and reactions with other key radicals (Sun et al., 2019). The thermal decomposition of O₃ releases O₂ and O via R11:



In the reactions of O₃ and hydrocarbons, O₂ and further oxidated intermediates are formed through R12:



The reactions of O₃ and radicals are related to O₃ concentrations. O₃ will react with OH to form HO₂ as follows:



O₃ molecules react with O and generate O₂ through R16 in cases with $\alpha = 1.5 \sim 3$. When α is higher than 2, O₃ will react with H and O₃ by R17 and R18.



As discussed above, O₃ molecules can promote the oxidation process of reactants directly. In addition, O₃ can also facilitate the formation O₂, OH, HO₂, HO₃ and H₂O₂, which accounts for the increasing trends of O₂ molecules in the O₃ cases (Fig. 2c) and maximum numbers of OH, HO₂, HO₃ and H₂O₂ with α (Fig. 3). Moreover, the increase in active radicals enhances the combustion process resulting in the faster consumption rates of C₅H₅N molecules, as shown in Fig. 2a and 2b.

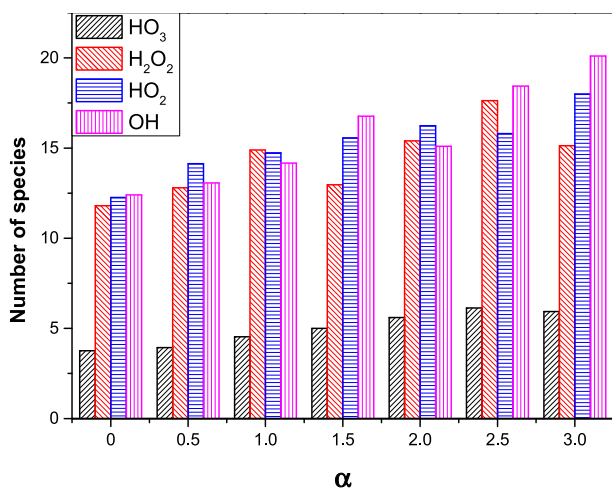


Fig. 3. Maximum numbers of HO₃, H₂O₂, HO₂ and HO.

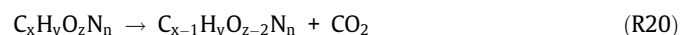
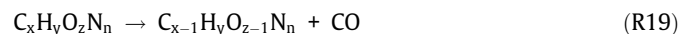
3.3. Effects of O₃ on the production of main products

For nitrogen-free products, Fig. 4a and 4b suggest that the number of CO decreases with increasing α , however, the increase of O₃ enhances CO₂ production during C₅H₅N combustion when α changes from 0 to 1.5. When α is greater than 1.5, the changes of CO and CO₂ production with α are not significant. In Fig. 4c and 4d, the yields of NO and NO₂ show a similar trend with CO and CO₂, respectively. As shown in Fig. 4f, the number of N₂ decreases as the number of O₃ rises when α is greater than 0.5. By contrast, NO_x presents an opposite trend with N₂ as shown in Fig. 4e. The influence of O₃ on the generation of NO_x and CO agrees well with previous studies (Tachibana et al., 1991; Nasser et al., 1998).

In this section, the effects of O₃ addition on the yield of products are analysed. To further identify the effects of O₃ on the underlying mechanisms of key products generation, the reaction pathways of nitrogen-containing and nitrogen-free products are scrutinized in Section 3.4 and 3.5, respectively.

3.4. Reaction pathways of CO and CO₂

There are two stages for the generation of nitrogen-containing products during the C₅H₅N oxidation. The initial formation of CO and CO₂ is from the thermal decomposition of oxygen-containing intermediates as shown in R19 and R20. Then, CO will be converted to CO₂ through the reactions with reactive radicals (O₂, O₃, HO₂, HO₃ and H₂O₂).



As shown in Fig. 5, the effects of O₃ on the ratios of R19 and R20 occurrence are insignificant, with individual percentages of 63 % and 37 %, respectively. The result indicates that the increase of CO₂ production with O₃ addition is by the promotion of conversion from CO to CO₂ during C₅H₅N combustion. Table 2 illustrates NF of main elementary pathways linked with conversion from CO to CO₂. Results indicate that O₃ promotes the conversion from CO to CO₂ significantly when α is less than 1.5, but the profiles of CO and CO₂ almost remain the same with $\alpha = 1.5 \sim 3$, which is in good agreement with O₃ influence on the yields of CO and CO₂ in Fig. 4.

There are six pathways for CO consumption, that is, CO → CO₂, CO → CO₃, CO → CHO₂, CO → CHO₃, CO → CHO₄ and CO → CO₄. As shown in Table 2, the NF of CO → CO₃ shows an upward trend as α increases. By contrast, O₃ has insignificant influence on the conversion from CO to CHO₃. The reactions generating CO₃ and CHO₃ from CO are through R21 and R22 as shown in Table 3.

The pathways of CO to CO₂ and CHO₂ show similar trends, which peak at $\alpha = 1.5$ and 0.5, respectively, and then decrease with the increase of O₃ addition in the C₅H₅N oxidation. The channels converting from CO to CHO₂ are shown in R23 to R25.

The reaction of CO and OH dominates in the formation of CHO₂. CO can be converted to CO₂ via six ways as demonstrated in R26 to R31.

When α is 0 or 3, the reaction CO with H₂O₂ forming CO₂ is observed (R32). CO molecules will react with O₃ producing CO₂ in all O₃ addition cases (R33).

Moreover, O₃ promotes the reactions of R29, R31 and R33 and enhances the conversion from CO to CO₂ with $\alpha = 0-1.5$. When α is larger than 1.5, the NF of reactions R26, R27 and R31 is reduced, resulting in the reduction of the conversion from CO to CO₂. Additionally, CO will be converted to CHO₄ and CO₄ at $\alpha = 3$ via R34 and R35.

Mutual transformation pathways are found for key intermediates generated by R21 to R35 (such as CHO₂ → CHO₄, CO₃ → CHO₃).

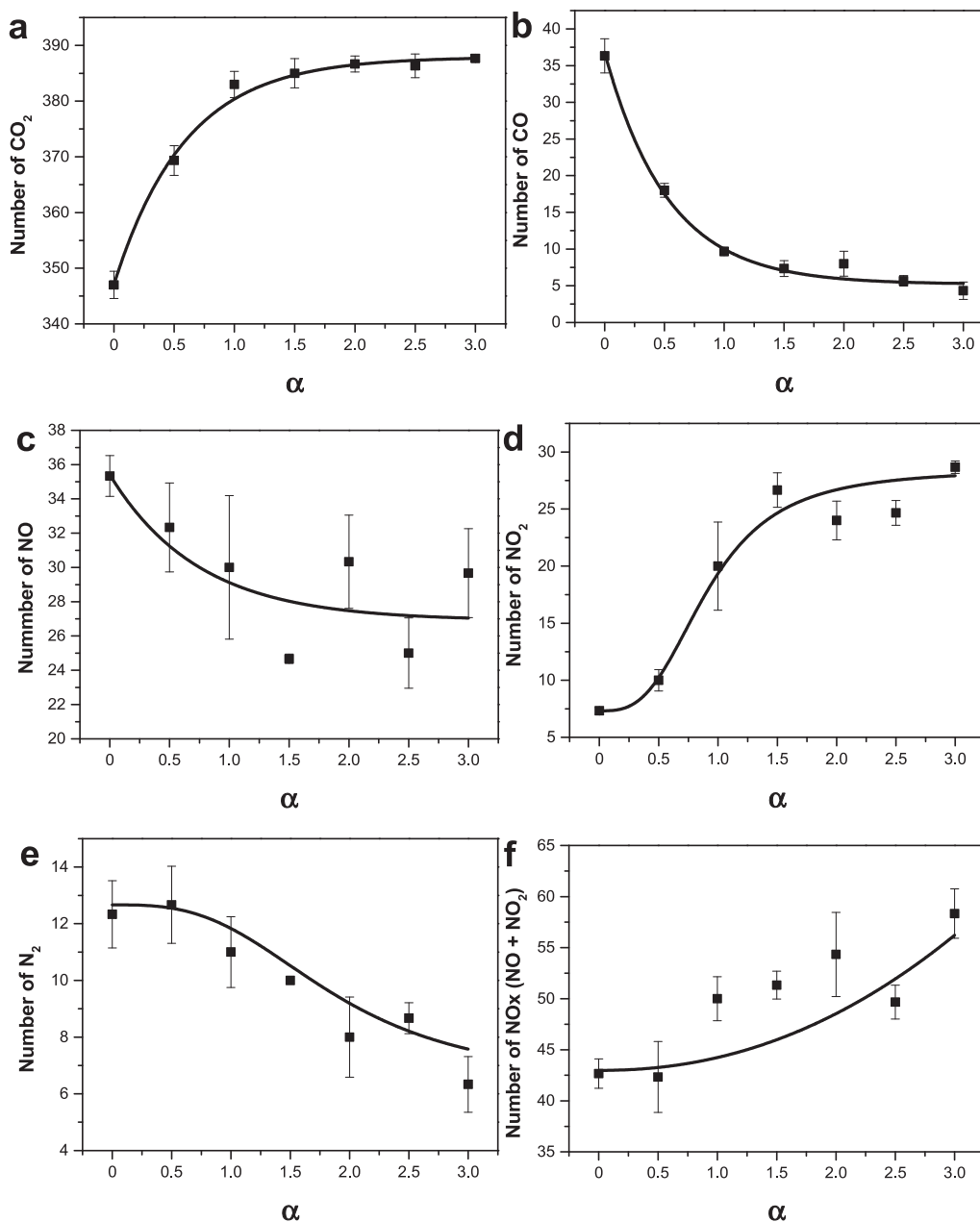


Fig. 4. Effects of O₃ on the yield of main products. (a) CO₂; (b) CO; (c) NO; (d) NO₂; (e) N₂; (f) NOx.

Here we mainly focus on the transfer pathways of CO₂ generation. Table 3 shows the NF of pathways generating CO₂, which are CO → CO₂, CO₃ → CO₂, CHO₂ → CO₂, CHO₃ → CO₂, CHO₄ → CO₂ and CO₄ → CO₂. Overall, O₃ promotes the conversion from CO, CHO₃, CHO₄ to CO₂. The NF of pathway CHO₂ → CO₂ peaks at $\alpha = 0.5$, and slightly decreases as α rises to 3. The NFs of the pathway from CO₄ to CO₂ are zero with $\alpha = 0 \sim 1.5$, however O₃ enhances the CO₂ formation when α is higher than 1.5.

Regarding the pathway CO₃ to CO₂, CO₂ is generated by thermal decomposition of CO₃ and reactions of CO₃ with H₂O, OH, O₂, CO and HO₂, as shown in R36 to R41. R36 to R39 are commonly observed in all cases. R40 occurs in $\alpha = 0 \sim 1.5$, 2 and 2.5 cases and R41 occurs with α from 1 to 3. In addition, the increase in NF of CO₂ formation by CO₃ with increasing α is due to the enhancement of R36 by O₃ molecules. CHO₂ conversion to CO₂ is via channels R42 to R46.

R42 - R44 take place in all conditions. R45 occurs when α is 0 and 1 ~ 2. R46 happens in $\alpha = 0.5, 1, 2.5$ and 3 cases. R42 is the main pathway from CHO₂ to CO₂. The conversion from CHO₃ to CO₂ is via R47 and R48, and R48 only occurs in the $\alpha = 1, 2$ and 3 cases. The rising O₃ addition promotes R48, which is the main reason for the upward profile of CHO₃ → CO₂. The pathways of CO₂ formation by CHO₄ and CO₄ are shown in R49 and R50, respectively.

3.5. Reaction pathways of NO, NO₂ and N₂

Fig. 6 illustrates the transfer pathways of NO and NO₂ under different α values. The starting radicals of CNO, HNO, CNO₂ and CHNO₃ are important precursors of NOx formation during C₅H₅N oxidation. More details of C₅H₅N oxidation mechanisms can be found in previous studies (Luo et al., 2019; Ikeda et al., 2000). Dur-

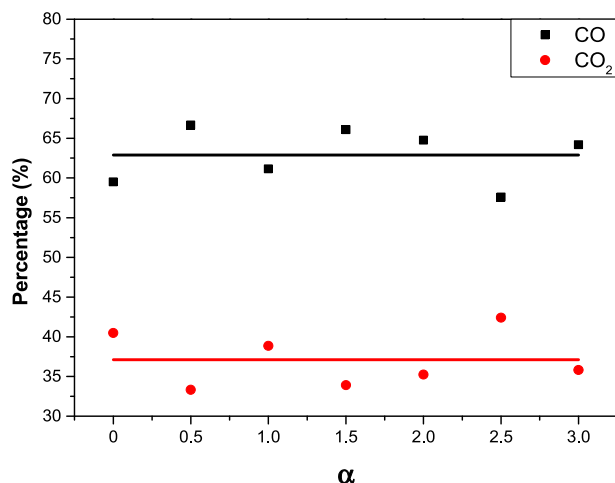


Fig. 5. Percentages of CO and CO₂ generated from oxygen-containing intermediates decomposition.

ing NO generation, the pathways from CNO₃, CNO₂, HNO and CHNO₃ to NO occur in all conditions, and NO₃ → NO is observed in the $\alpha = 0.5 \sim 2$ and 3 cases. Four pathways lead to NO consumption: NO → HNO₃, NO → NO₂, NO → HNO₂ and NO → CN₂O₂. The channel NO → CN₂O₂ only takes place with $\alpha = 0 \sim 2.5$. Besides, HNO₃ and HNO₂ are also essential intermediates for NO₂ formation. When α ranges from 0.5 to 3, channels HNO₄ → NO₂ and CNO₂ → CNO₄ → NO₂ are detected, and HNO₄ mainly comes from the conversion of HNO₃, HNO₂ and NO₃. Regarding NO₂ consumption, the pathways of NO₂ to NO₃ and CNO₃ occur in cases with $\alpha = 0.5 \sim 1.5$ & $2.5 \sim 3$ and $0 \sim 1$ & 2 & 3 , respectively.

To further explain O₃ influence on the yields of NO and NO₂, we explored the NF analysis of those products as shown in Table 4. The total net NF of NO presents a downward trend, which agrees well with the yield of NO under different O₃ concentrations. Besides, the NO generation is promoted slightly by the increasing α value; by contrast, O₃ enhances NO consumption significantly. Thus, it can be concluded that O₃ influence on NO consumption plays a dominant role in NO production. Besides, the conversions from NO to NO₂ and HNO₂ increase with α values. The NF of channel NO → HNO₃ first decreases until it reaches the lowest point at $\alpha = 1.5$, and then increases. Regarding the conversion from NO to CN₂O₂, the change in NFs is not significant when α increases from 0 to 1, but decreases when α is higher than 1.

As shown in Table 5, the conversion between NO and NO₂ is through R51 to R58. Among them, R51, R52, R54 and R55 are observed in cases with O₃ addition. R53 occurs in $\alpha = 0 \sim 2.5$ cases.

Table 2

Net flux (NF) of main elementary pathways linked with conversion from CO to CO₂.

Pathways	0	0.5	1	1.5	2	2.5	3
CO → CO ₂	171	164	165	181	178	151	155
CO → CO ₃	259	273	280	283	312	323	310
CO → CHO ₂	126	147	143	133	121	121	125
CO → CHO ₃	21	24	23	26	24	23	26
CO → CHO ₄	0	0	0	0	0	0	7
CO → CO ₄	0	0	0	0	0	0	4
Total CO consumption	577	608	611	623	635	618	627
CO → CO ₂	171	164	165	181	178	151	155
CO ₃ → CO ₂	163	223	215	232	232	259	232
CHO ₂ → CO ₂	101	155	106	138	123	118	124
CHO ₃ → CO ₂	65	70	64	76	76	71	75
CHO ₄ → CO ₂	10	12	28	11	19	38	27
CO ₄ → CO ₂	0	5	2	1	9	15	30
Total CO ₂ generation	510	629	580	639	637	652	643

R56 takes place with α of 1 and 3. R57 is observed in $\alpha = 0.5 \sim 3$ cases. R58 only happens in the $\alpha = 2$ case. When α ranges from 0 \sim 1.5, R51, R52 and R54 play key roles in the yield of NO. Specifically, O₃ promotes the conversion from NO to NO₂ via R52 and R54, but weakens the channel NO₂ → NO through R51, accounting for the increase of NO consumption via the channel NO → NO₂ when α is less than 1.5. As α is larger than 1.5, O₃ has insignificant influence on R51, R52 and R54, but it promotes the overall generation of NO₂.

The reactions of NO → CN₂O₂ and NO → HNO₃ are presented in R59 and R60, respectively. The pathway from NO to HNO₂ is via R61 to R64. Among them, R61 and R62 are spotted in all cases. R63 is observed in $\alpha = 0.5$ and $2 \sim 3$ cases. R64 is found in $\alpha = 0.5 \sim 1$ and $2 \sim 3$ conditions. In addition, NO + HO → HNO₂ (R62) plays dominant roles in the conversion from NO to HNO₂.

Regarding the NFs of NO₂ consumption and formation, the total net NF of NO₂ is in good consistence with NO₂ production at various O₃ conditions. Besides, the NF of NO₂ almost remains the same, thus the NO₂ amount is determined by the NF of NO₂ generation. Also, O₃ promotes the conversions of NO₂ generation from NO and HNO₄. The NF of the pathway HNO₃ → NO₂ shows a downward trend with $\alpha = 0 \sim 1$, but this channel is enhanced by O₃ when α is larger than 1. As to the pathways HNO₂ → NO₂ and CNO₂ → NO₂, the NF of these reactions increases to the peak at $\alpha = 1.5$ and then decreases. The results indicate that the promotion effects of O₃ on NO₂ generation from NO, HNO₂, CNO₄ and HNO₄ cause the increase of NO₂ amount with α ranging from 0 to 1.5. Moreover, the inhibition of NO₂ formation from HNO₂ and CNO₄ causes the number of NO₂ to almost remain the same when α is from 1.5 to 3.

The reactions of NO₂ formation from HNO₃, CNO₄ and HNO₄ are shown in R65 to R67. As to conversion of HNO₂ to NO₂ by channels R68 to R70, the reaction between HNO₂ and O₂ (R69) is the main cause for NO₂ formation.

As for the N₂ generation, C₂N₂O₂ is the key precursor generated by R71. Two pathways for N₂, are C₂N₂O₂ → N₂ (R72) and C₂N₂O₂ → CN₂O → N₂ (R73 to R74). The increase of O₃ addition during C₅H₅N combustion inhibits the conversion from C₂N₂O₂ and CN₂O to N₂ resulting in the decrease of N₂ formation with α value rising.

3.6. Discussion

When O₃ is added in the C₅H₅N combustion, it affects the consumption rates of reactants and yields of productions by reacting with intermediates directly and promotes the formation of active radicals like OH, HO₂, HO₃ and H₂O₂.

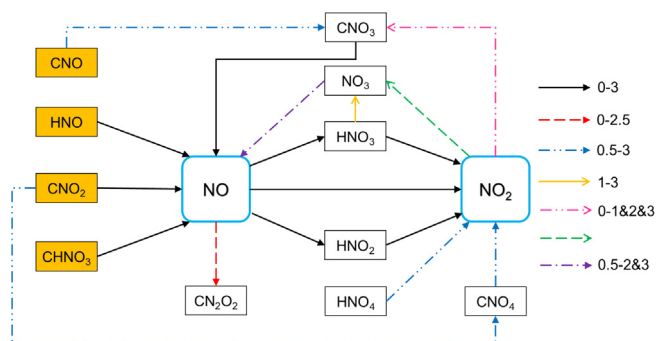
According to the current study, O₃ shows satisfactory performance on reducing CO and NO emissions with $\alpha = 0 \sim 1.5$. The decrease of NO emissions can reduce operating costs in exhaust

Table 3
Summary of reactions on the conversion from CO to CO₂.

ID	Reactions	ID	Reactions
R21	CO + O ₂ → CO ₃	R36	CO ₃ → CO ₂ + O
R22	CO + HO ₂ → CHO ₃	R37	CO ₃ + H ₂ O → CO ₂ + HO + HO
R23	CO + OH → CHO ₂	R38	CO ₃ + OH → CO ₂ + HO ₂
R24	CO + H ₂ O ₂ → CHO ₂ + HO	R39	CO ₃ + O ₂ → CO ₂ + O ₃
R25	CO + HO ₃ → O ₂ + CHO ₂	R40	CO ₃ + CO → CO ₂ + CO ₂
R26	CO + HO ₂ → CO ₂ + HO	R41	CO ₃ + HO ₂ → CO ₂ + O ₂ + HO
R27	CO + O ₂ → CO ₂ + O	R42	CHO ₂ + O ₂ → CO ₂ + HO ₂
R28	CO + NO ₂ → CO ₂ + NO	R43	CHO ₂ → CO ₂ + H
R29	CO + O ₂ + HO → CO ₂ + HO ₂	R44	CHO ₂ + HO → H ₂ O + CO ₂
R30	CO + O → CO ₂	R45	CHO ₂ + H ₂ O ₂ → H ₂ O + CO ₂ + HO
R31	CO + OH → CO ₂ + H	R46	O ₂ + CHO ₂ → CO ₂ + HO + O
R32	CO + H ₂ O ₂ → H ₂ O + CO ₂	R47	CHO ₃ → CO ₂ + HO
R33	CO + O ₃ → CO ₂ + O ₂	R48	CHO ₃ + O ₂ → CO ₂ + HO ₃
R34	CO + O ₂ + HO → CHO ₄	R49	CHO ₄ → CO ₂ + HO ₂
R35	CO + O ₃ → CO ₄	R50	CO ₄ → CO ₂ + O ₂

Table 5
Summary of reactions related to NO, NO₂ and N₂.

ID	Reactions	ID	Reactions
R51	CO + NO ₂ → CO ₂ + NO	R63	HNO ₂ + HO ₂ → H ₂ O + O ₂ + NO
R52	HO ₂ + NO → HO + NO ₂	R64	O ₂ + HNO ₂ → HO ₃ + NO
R53	H ₂ O ₂ + NO → H ₂ O + NO ₂	R65	HNO ₃ → HO + NO ₂
R54	NO + O → NO ₂	R66	CNO ₄ → CO ₂ + NO ₂
R55	H + NO ₂ → NO + HO	R67	HNO ₄ → HO ₂ + NO ₂
R56	CO ₃ + NO → CO ₂ + NO ₂	R68	HNO ₂ + HO → H ₂ O + NO ₂
R57	HO ₂ + NO ₂ → O ₂ + NO + HO	R69	HNO ₂ + O ₂ → HO ₂ + NO ₂
R58	NO + O ₃ → O ₂ + NO ₂	R70	HNO ₃ → H + NO ₂
R59	NO + CNO → CN ₂ O ₂	R71	CNO + CNO → C ₂ N ₂ O ₂
R60	NO + HO ₂ → HNO ₃	R72	C ₂ N ₂ O ₂ → N ₂ + 2CO
R61	H ₂ O ₂ + NO → HNO ₂ + HO	R73	C ₂ N ₂ O ₂ → CN ₂ O + CO
R62	NO + HO → HNO ₂	R74	CN ₂ O → N ₂ + CO

**Fig. 6.** Effects of O₃ on the transfer pathways of NO and NO₂. The particles in the yellow box are the starting intermediates. The numerical values in the figure are values of α .

gas treatment by the selective catalytic reduction (SCR) technology, where ammonia is used to reduce NO to N₂ with expensive catalysts. Meanwhile, O₃ promotes the conversion from NO to NO₂ resulting in increased NO₂ emissions, which can be removed

Table 4
Net flux (NF) of main elementary pathways linked with NO, NO₂ and N₂.

Pathways	0	0.5	1	1.5	2	2.5	3
CNO ₂ → NO	90	101	113	112	117	96	127
HNO → NO	13	18	12	6	11	11	25
CHNO ₃ → NO	14	6	11	9	2	9	5
CNO ₃ → NO	12	6	12	9	6	5	6
NO ₃ → NO	0	5	1	1	9	0	-2
NO generation	129	136	149	137	145	121	161
NO → CN ₂ O ₂	8	7	9	2	1	4	0
NO → NO ₂	3	10	38	18	27	22	33
NO → HNO ₃	17	16	7	8	5	17	24
NO → HNO ₂	2	-2	32	51	24	53	32
NO consumption	30	31	86	79	57	96	89
Net NO generation	99	105	63	58	88	25	72
HNO ₃ → NO ₂	13	10	1	14	6	11	24
HNO ₂ → NO ₂	1	12	17	44	18	26	25
CNO ₄ → NO ₂	0	9	13	6	10	12	8
HNO ₄ → NO ₂	0	1	2	-5	8	2	8
NO ₂ generation	17	42	71	77	69	73	98
NO ₂ → CNO ₃	7	8	10	0	5	0	10
NO ₂ → NO ₃	0	4	-2	-1	0	7	-1
NO ₂ consumption	7	12	8	-1	5	7	9
Net NO ₂ generation	10	30	63	78	64	66	89
CN ₂ O → N ₂	5	11	7	4	0	5	0
C ₂ N ₂ O ₂ → N ₂	7	5	7	6	7	0	0
N ₂ O → N ₂	0	0	0	0	0	0	2
N ₂ formation	12	16	14	10	7	5	2

by water. However, O₃ addition increases NO_x (the total of NO and NO₂ emissions) emissions by inhibiting the N₂ formation, which is in consistence with previous studies (Tachibana et al., 1991; Nasser et al., 1998). Thus, the O₃ addition in combustion systems should be well designed in practice.

4. Conclusions

ReaxFF MD simulations are performed to investigate the effects of ozone on pyridine oxidation. Time evolutions of main species suggest that ozone enhances the pyridine combustion. In addition, the chemical reactions of ozone are identified and quantified. The influence of ozone on the yields of products is explored, and results suggest that ozone facilitates the conversion from CO to CO₂ and NO to NO₂. Finally, we reveal the underlying mechanisms at the atomic level for products generation during pyridine oxidation with varying amount of ozone addition. This research demonstrates that ReaxFF MD is a promising method to reveal reaction mechanisms of fuel-NO_x formation and provides theoretical guidance on the NO_x control by O₃ assisted combustion of fossil fuels. The study contributes to a deeper understanding of the role of ozone in pyridine oxidation, which may be helpful to reducing NO_x and CO emissions effectively.

CRediT authorship contribution statement

Zhongze Bai: Conceptualization, Methodology, Software, Investigation, Data curation, Visualization, Writing – original draft. **Xi Zhuo Jiang:** Supervision, Writing – review & editing. **Kai H. Luo:** Supervision, Funding acquisition, Resources, Project administration, Writing – review & editing.

Data availability

Data will be made available on request.

Declaration of Competing Interest

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

Acknowledgements

Support from the UK Engineering and Physical Sciences Research Council under the project “UK Consortium on Mesoscale Engineering Sciences (UKCOMES)” (Grant No. EP/R029598/1) is gratefully acknowledged. This work made use of computational support by CoSeC, the Computational Science Centre for Research Communities, through UKCOMES.

References

- Arvelos, S., Hori, C.E., 2020. ReaxFF study of ethanol oxidation in O₂/N₂ and O₂/CO₂ Environments at high temperatures. *J. Chem. Inf. Model.* 60 (2), 700–713.
- Axworthy, A.E., Dayan, V.H., Martin, G.B., 1978. Reactions of fuel-nitrogen compounds under conditions of inert pyrolysis. *Fuel* 57 (1), 29–35.
- Bai, Z., Jiang, X.Z., Luo, K.H., 2021. Effects of water on pyridine pyrolysis: a reactive force field molecular dynamics study. *Energy*. 121798.
- Bowman, C.T., 1992. Control of combustion-generated nitrogen oxide emissions: technology driven by regulation. *Symposium (International) on Combustion*. 24 (1), 859–78.
- Bai, Z., Jiang, X.Z., Luo, K.H., 2023. Reactive force field molecular dynamics simulation of pyridine combustion assisted by an electric field. *Fuel* 333, 126455.
- Dontgen, M., Przybylski-Freund, M.-D., Kröger, L.C., Kopp, W.A., Ismail, A.E., Leonhard, K., 2015. Automated discovery of reaction pathways, rate constants, and transition states using reactive molecular dynamics simulations. *J. Chem. Theory Comput.* 11 (6), 2517–2524.
- Feng, M., Jiang, X.Z., Luo, K.H., 2019. A reactive molecular dynamics simulation study of methane oxidation assisted by platinum/graphene-based catalysts. *Proc. Combust. Inst.* 37 (4), 5473–5480.
- Foucher, F., Higelin, P., Mounaïm-Rousselle, C., Dagaut, P., 2013. Influence of ozone on the combustion of n-heptane in a HCCI engine. *Proc. Combust. Inst.* 34 (2), 3005–3012.
- Gao, X., Zhang, Y., Adusumilli, S., Seitzman, J.M., Sun, W., Ombrello, T., et al. (Eds.), 2015. The Effect of Ozone Addition on Flame Propagation. 53rd AIAA Aerospace Sciences Meeting.
- Glarborg, P., Jensen, A., Johnsson, J.E., 2003. Fuel nitrogen conversion in solid fuel fired systems. *Prog. Energy Combust. Sci.* 29 (2), 89–113.
- Gluckstein, M.E., Morrison, R.B., Khammash, T.B., 1955. Combustion with ozone-modification of flame speeds C₂ hydrocarbon-air mixtures.
- Humphrey, W., Dalke, A., Schulten, K., 1996. VMD: visual molecular dynamics. *J. Mol. Graph.* 14 (1), 33–38.
- Ikeda, E., Nicholls, P., Mackie, J.C., 2000. A kinetic study of the oxidation of pyridine. *Proc. Combust. Inst.* 28 (2), 1709–1716.
- Jiang, X.Z., Luo, K.H., 2021. Reactive and electron force field molecular dynamics simulations of electric field assisted ethanol oxidation reactions. *Proc. Combust. Inst.* 38 (4), 6605–6613.
- Jiang, X.Z., Feng, M., Zeng, W., Luo, K.H., 2019. Study of mechanisms for electric field effects on ethanol oxidation via reactive force field molecular dynamics. *Proc. Combust. Inst.* 37 (4), 5525–5535.
- Jiang, X.Z., Luo, K.H., Ventikos, Y., 2020. Principal mode of Syndecan-4 mechanotransduction for the endothelial glycocalyx is a scissor-like dimer motion. *Acta Physiol.* 228 (3), e13376.
- Liu, J., Guo, X., 2017. ReaxFF molecular dynamics simulation of pyrolysis and combustion of pyridine. *Fuel Process. Technol.* 161, 107–115.
- Luo, J., Zou, C., He, Y., Jing, H., Cheng, S., 2019. The characteristics and mechanism of NO formation during pyridine oxidation in O₂/N₂ and O₂/CO₂ atmospheres. *Energy* 187, 115954.
- Mok, Y.S., Lee, H.-J., 2006. Removal of sulfur dioxide and nitrogen oxides by using ozone injection and absorption–reduction technique. *Fuel Process. Technol.* 87 (7), 591–597.
- Nasser, S.H., Morris, S., James, S., 1998. A novel fuel efficient and emission abatement technique for internal combustion engines. *SAE Trans.*, 1410–1425.
- Nelson, P.F., Kelly, M.D., Wornat, M.J., 1991. Conversion of fuel nitrogen in coal volatiles to NO_x precursors under rapid heating conditions. *Fuel* 70 (3), 403–407.
- Senftle, T.P., Hong, S., Islam, M.M., Kylasa, S.B., Zheng, Y., Shin, Y.K., et al., 2016. The ReaxFF reactive force-field: development, applications and future directions. *NPJ Comput. Mater.* 2 (1), 1–14.
- Solomon, P.R., Colket, M.B., 1978. Evolution of fuel nitrogen in coal devolatilization. *Fuel* 57 (12), 749–755.
- Sun, W., Gao, X., Wu, B., Ombrello, T., 2019. The effect of ozone addition on combustion: Kinetics and dynamics. *Prog. Energy Combust. Sci.* 73, 1–25.
- Tachibana, T., Hirata, K., Nishida, H., Osada, H., 1991. Effect of ozone on combustion of compression ignition engines. *Combust. Flame* 85 (3–4), 515–519.
- Thompson, A.P., Aktulga, H.M., Berger, R., Bolintineanu, D.S., Brown, W.M., Crozier, P.S., et al., 2022. LAMMPS—a flexible simulation tool for particle-based materials modeling at the atomic, meso, and continuum scales. *Comput. Phys. Commun.* 271, 108171.
- Van Duin, A.C., Dasgupta, S., Lorant, F., Goddard, W.A., 2001. ReaxFF: a reactive force field for hydrocarbons. *J. Phys. Chem. A* 105 (41), 9396–9409.
- Weng, W., Nilsson, E., Ehn, A., Zhu, J., Zhou, Y., Wang, Z., et al., 2015. Investigation of formaldehyde enhancement by ozone addition in CH₄/air premixed flames. *Combust. Flame* 162 (4), 1284–1293.
- Yamada, H., Yoshii, M., Tezaki, A., 2005. Chemical mechanistic analysis of additive effects in homogeneous charge compression ignition of dimethyl ether. *Proc. Combust. Inst.* 30 (2), 2773–2780.
- Zhang, L., Duin, A.C.V., Zybin, S.V., Goddard III, W.A., 2009. Thermal decomposition of hydrazines from reactive dynamics using the ReaxFF reactive force field. *J. Phys. Chem. B* 113 (31), 10770–10778.
- Zhang, H., Qin, H., Zhao, L., Liu, J., Wu, J., Jiang, X., 2021. One new channel for the reduction of NO during gasification condition: An insight from DFT calculations. *Combust. Sci. Technol.*, 1–19.
- Zhang, Y., Zhu, M., Zhang, Z., Shang, R., Zhang, D., 2016. Ozone effect on the flammability limit and near-limit combustion of syngas/air flames with N₂, CO₂, and H₂O dilutions. *Fuel* 186, 414–421.
- Zhang, L., Zybin, S.V., Van Duin, A.C., Dasgupta, S., Goddard III, W.A., Kober, E.M., 2009. Carbon cluster formation during thermal decomposition of octahydro-1, 3, 5, 7-tetranitro-1, 3, 5, 7-tetrazocine and 1, 3, 5-triamino-2, 4, 6-trinitrobenzene high explosives from ReaxFF reactive molecular dynamics simulations. *J. Phys. Chem. A* 113 (40), 10619–10640.