

<https://doi.org/10.1038/s41612-025-01022-y>

# Driving factors and photochemical impacts of Cl<sub>2</sub> in coastal atmosphere of Southeast China



Gaojie Chen<sup>1,2,3</sup>, Xiaolong Fan<sup>1,2</sup>, Ziyi Lin<sup>1,2,3</sup>, Xiaoting Ji<sup>1,2,3</sup>, Ziyang Chen<sup>1,2,3</sup>, Lingling Xu<sup>1,2</sup> & Jinsheng Chen<sup>1,2</sup> ✉

The elevated levels of molecular chlorine (Cl<sub>2</sub>) have been observed both during the daytime or nighttime, yet the key drivers influencing Cl<sub>2</sub> formation remain unclear. In this study, we observed the distinct daytime and nighttime peaks of Cl<sub>2</sub> in coastal atmosphere of Southeast China. Field observations combined with machine learning revealed that daytime Cl<sub>2</sub> generation was driven by nitrate (especially ammonium nitrate) photolysis, and aerosol iron photochemistry, while the N<sub>2</sub>O<sub>5</sub> uptake on aerosols containing chloride contributed to nighttime Cl<sub>2</sub> formation. Around noon, alkane oxidation rates by Cl radicals generated from Cl<sub>2</sub> photolysis surpassed those of OH radicals, leading to a 44% increment in RO<sub>2</sub> radical levels and a 42% enhancement in net O<sub>3</sub> production rates. This study offers new insights into the production and loss processes of Cl<sub>2</sub> in the tropospheric atmosphere, emphasizing its significance in coastal photochemical pollution.

Chlorine radicals (Cl·) are highly reactive atmospheric oxidants that play a crucial role in the formation of ozone (O<sub>3</sub>) and secondary organic aerosols (SOA)<sup>1,2</sup>. Currently, molecular chlorine (Cl<sub>2</sub>) and nitryl chloride (ClNO<sub>2</sub>) are the primary precursors of Cl·<sup>3–5</sup>. Previous studies identified ClNO<sub>2</sub> photolysis as the dominant source of Cl· in coastal and inland regions<sup>4,6–10</sup>, particularly in the morning<sup>5,6</sup>. However, recent observations indicated substantial Cl<sub>2</sub> formation in polluted atmospheres<sup>3,5,11</sup>, establishing Cl<sub>2</sub> as a significant daytime source of Cl·, especially in the afternoon<sup>3,12</sup>.

Anthropogenic activities, such as wastewater treatment, coal combustion, the use of chlorine-containing disinfectants, and industrial processes, have been considered as potential sources of atmospheric Cl<sub>2</sub><sup>9,13,14</sup>. Additionally, Cl<sub>2</sub> can be produced through heterogeneous reactions involving ClNO<sub>2</sub>, hypochlorous acid (HOCl), chlorine nitrate (ClONO<sub>2</sub>), O<sub>3</sub>, hydroxyl (OH) radicals, and titanium dioxide (TiO<sub>2</sub>) with chloride on aerosols<sup>12,15–17</sup>. Cl<sub>2</sub> is also likely co-produced with ClNO<sub>2</sub> from the uptake of dinitrogen pentoxide (N<sub>2</sub>O<sub>5</sub>) on acidic aerosols containing chloride during the nighttime<sup>18,19</sup>. Recently, Peng et al. suggested that the photodissociation of aerosol nitrate is the dominant source of daytime Cl<sub>2</sub> in Hong Kong<sup>3</sup>, while Chen et al. proposed a Cl<sub>2</sub> formation mechanism driven by aerosol iron photochemistry, accounting for over 90% of Cl<sub>2</sub> production in North China<sup>20</sup>. Despite these advancements, the key drivers of Cl<sub>2</sub> generation and loss processes remain elusive, limiting our further understanding of its production mechanisms.

In this study, intensive observations of Cl<sub>2</sub> and related factors were conducted in a coastal city of Southeast China during the autumn of 2022. Both daytime and nighttime peaks in Cl<sub>2</sub> levels were detected, suggesting strong local sources of Cl<sub>2</sub>. We used the machine learning method combined with the observational data (including meteorological parameters, aerosol compositions, and trace gases) to identify the most important factors affecting Cl<sub>2</sub> production and loss. Box model simulations further demonstrated the photochemical impacts of Cl<sub>2</sub> photolysis. Overall, this study revealed the key factors driving Cl<sub>2</sub> production in urban environments of coastal area, providing a scientific foundation for future research aimed at quantifying its sources and assessing its impact on the atmospheric environment.

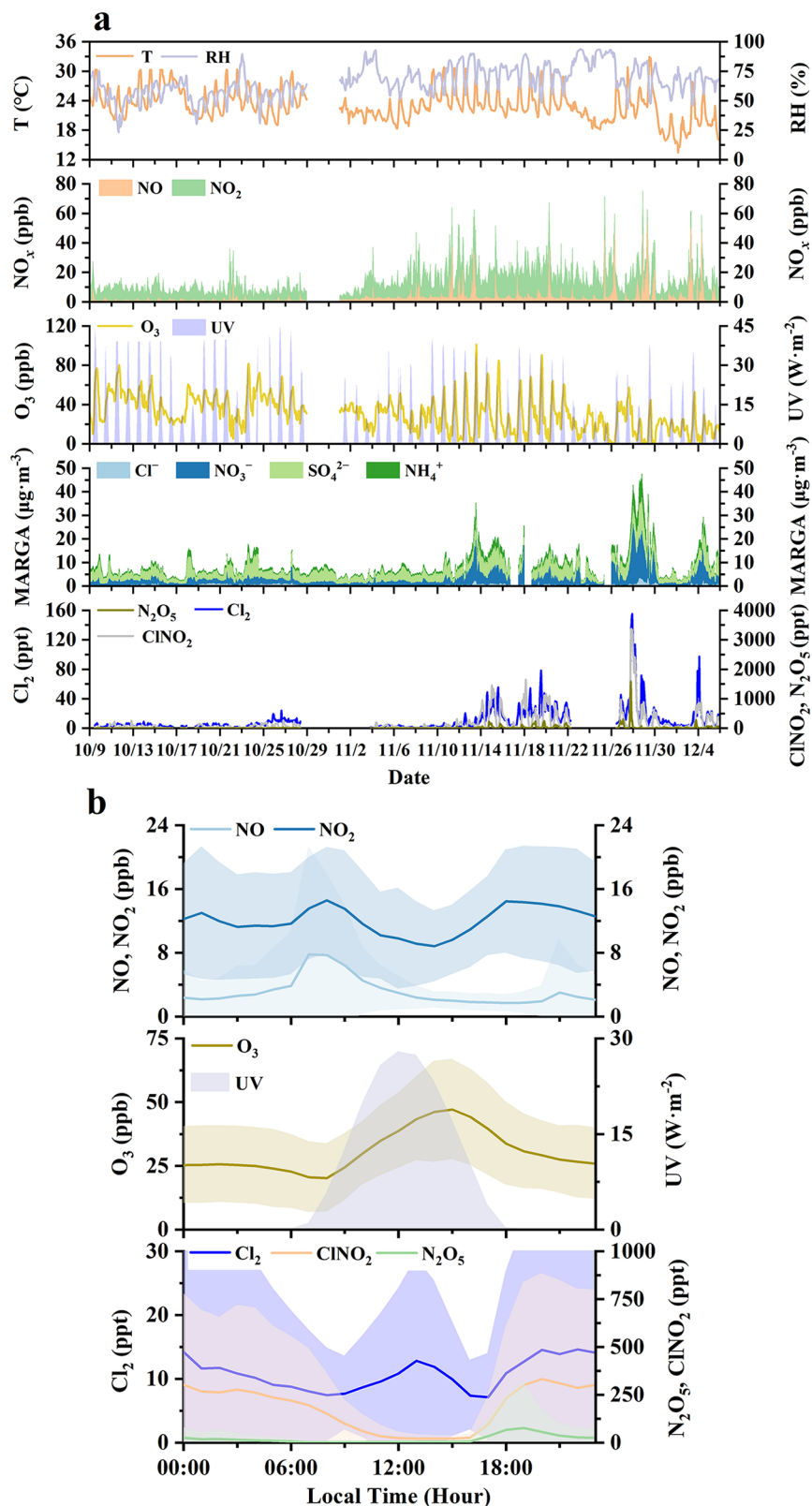
## Results and discussion

### Field measurement of Cl<sub>2</sub>

Intensive measurements of Cl<sub>2</sub> and related parameters were carried out in a coastal city of Southeast China. As depicted in Fig. 1a, elevated Cl<sub>2</sub> levels were frequently observed, particularly in late autumn, accompanied by increased concentrations of ClNO<sub>2</sub>, N<sub>2</sub>O<sub>5</sub>, and ionic components in PM<sub>2.5</sub>. The maximum levels of Cl<sub>2</sub> at our study site reached up to 155 ppt, exceeding what had been reported in Nanjing<sup>18</sup>, but were lower than those observed in Wangdu and Hong Kong (Table S1)<sup>3,11</sup>. Overall, Cl<sub>2</sub> concentrations exhibited a distinct monthly variation pattern, characterized by significantly lower levels in October compared to November. To

<sup>1</sup>Institute of Urban Environment, Chinese Academy of Sciences, Xiamen, China. <sup>2</sup>Fujian Key Laboratory of Atmospheric Ozone Pollution Prevention, Institute of Urban Environment, Chinese Academy of Sciences, Xiamen, China. <sup>3</sup>University of Chinese Academy of Sciences, Beijing, China. ✉e-mail: [jschen@iue.ac.cn](mailto:jschen@iue.ac.cn)

**Fig. 1 | Significant generation of  $\text{Cl}_2$  in a coastal city of Southeast China.** The time series of  $\text{Cl}_2$  and related parameters from October 9th to December 5th, 2022 (a). The average diurnal profile of  $\text{Cl}_2$  and other factors during the entire observation period (b).



systematically investigate the influence of air mass transport on  $\text{Cl}_2$  distribution at our study site, we conducted a comparative analysis of air mass trajectories from these two months, representing periods of lower and higher  $\text{Cl}_2$  concentrations, respectively. Using the Hybrid Single-Particle Lagrangian Integrated Trajectory (HYSPLOT) model, we calculated 24-hour backward trajectories for air masses arriving at 500 meters above ground

level<sup>21</sup>. The trajectory analysis demonstrated similar air mass characteristics between the two months (Fig. S1), with the study site primarily influenced by continental air masses from the northeastern coastal region, while the contribution from direct marine air masses was relatively minimal. Considering that our study site is situated in a typical urban environment, combined with the short photolytic lifetime of  $\text{Cl}_2$ , these findings strongly

suggest that  $\text{Cl}_2$  concentration distribution is primarily driven by local generation processes, with minimal influence from regional air mass transport.

For the daily variation pattern, previous studies have reported  $\text{Cl}_2$  peaks occurring either during the day or at night<sup>3,11,18</sup>, but our study site showed peak concentrations during both periods (Fig. 1b), suggesting the presence of both photochemically-driven daytime sources and non-photochemical nighttime sources in the local environment.

### Key influencing factors

To identify the key factors affecting the production and loss processes of  $\text{Cl}_2$ , we comprehensively compared the effects of meteorology (e.g., temperature (T), relative humidity (RH), ultraviolet radiation (UV), wind speed (WS), wind direction (WD), and boundary layer height (BLH)),  $\text{PM}_{2.5}$  and aerosol compositions (e.g., iron (Fe),  $\text{Cl}^-$ ,  $\text{NH}_4^+$ ,  $\text{SO}_4^{2-}$ , and  $\text{NO}_3^-$ ), and trace gases (e.g.,  $\text{N}_2\text{O}_5$ ,  $\text{O}_3$ , NO,  $\text{NO}_2$ , CO, and  $\text{SO}_2$ ) on  $\text{Cl}_2$  levels using an extreme gradient boosting (XGBoost) coupled with the Shapley additive explanations (SHAP) model (Fig. 2a). The results highlighted  $\text{N}_2\text{O}_5$ ,  $\text{NO}_3^-$ , UV,  $\text{NH}_4^+$ , and Fe as the most significant factors affecting  $\text{Cl}_2$  levels. Positive SHAP values, represented by red points, indicated that higher levels of these variables were associated with increased  $\text{Cl}_2$  concentrations, and vice versa. As presented in Fig. 2b, larger values of  $\text{N}_2\text{O}_5$ ,  $\text{NO}_3^-$ ,  $\text{NH}_4^+$ , and Fe contributed to the elevation of  $\text{Cl}_2$  levels, while UV exhibited a dual effect on  $\text{Cl}_2$  concentrations.

Figure 2c–h further illustrates the responses of  $\text{Cl}_2$  concentrations to changes in the five key factors, offering insights into how these factors affect  $\text{Cl}_2$  levels on average.  $\text{Cl}_2$  concentrations significantly increased when  $\text{N}_2\text{O}_5$ ,  $\text{NO}_3^-$ ,  $\text{NH}_4^+$ , and Fe concentrations exceeded 36.1 ppt,  $6.2 \mu\text{g}\cdot\text{m}^{-3}$ ,  $3.1 \mu\text{g}\cdot\text{m}^{-3}$ , and  $0.24 \mu\text{g}\cdot\text{m}^{-3}$ , respectively. Interestingly,  $\text{Cl}_2$  levels initially decreased and then increased as rising UV intensity. After sunrise, the intensifying sunlight accelerates  $\text{Cl}_2$  photolysis; however, under stronger UV in the afternoon,  $\text{Cl}_2$  sources related to photochemistry might strengthen to offset its photolytic loss.

### Potential production mechanisms

As mentioned before, it is found that  $\text{N}_2\text{O}_5$ ,  $\text{NO}_3^-$ , UV,  $\text{NH}_4^+$ , and Fe played very critical roles in the generation of  $\text{Cl}_2$ . Here, we further explored potential  $\text{Cl}_2$  production mechanisms associated with the five factors at our study site.

During the observation period, a strong correlation between nighttime  $\text{Cl}_2$  and  $\text{ClNO}_2$  ( $r = 0.87$ ) was observed (Fig. 3a), implying a common source for both species during the nighttime. It is acknowledged that nighttime  $\text{ClNO}_2$  is generated through the heterogeneous uptake process of  $\text{N}_2\text{O}_5$ <sup>7,10</sup>. Previous studies had suggested that  $\text{Cl}_2$  is likely a byproduct of  $\text{ClNO}_2$  formation through the uptake of  $\text{N}_2\text{O}_5$  on acidic aerosols<sup>18,19,22</sup>. Therefore, it is probably that the heterogeneous processes involving  $\text{N}_2\text{O}_5$  contributed to the nighttime generation of  $\text{Cl}_2$  at our study site. The XGBoost-SHAP model indicated that  $\text{N}_2\text{O}_5$  ranked first among all influencing factors. The positive SHAP value of  $\text{N}_2\text{O}_5$  indicates that higher concentrations of  $\text{N}_2\text{O}_5$  favor an increase in  $\text{Cl}_2$  concentrations, which aligns with the mechanism that  $\text{Cl}_2$  is primarily generated through the heterogeneous processes involving  $\text{N}_2\text{O}_5$  during the nighttime. In contrast, the negative SHAP value of NO suggests that higher concentrations of NO inhibit the formation of  $\text{NO}_3^-$ , thereby hindering the increase in  $\text{N}_2\text{O}_5$  concentrations and subsequently suppressing the generation of  $\text{Cl}_2$ .

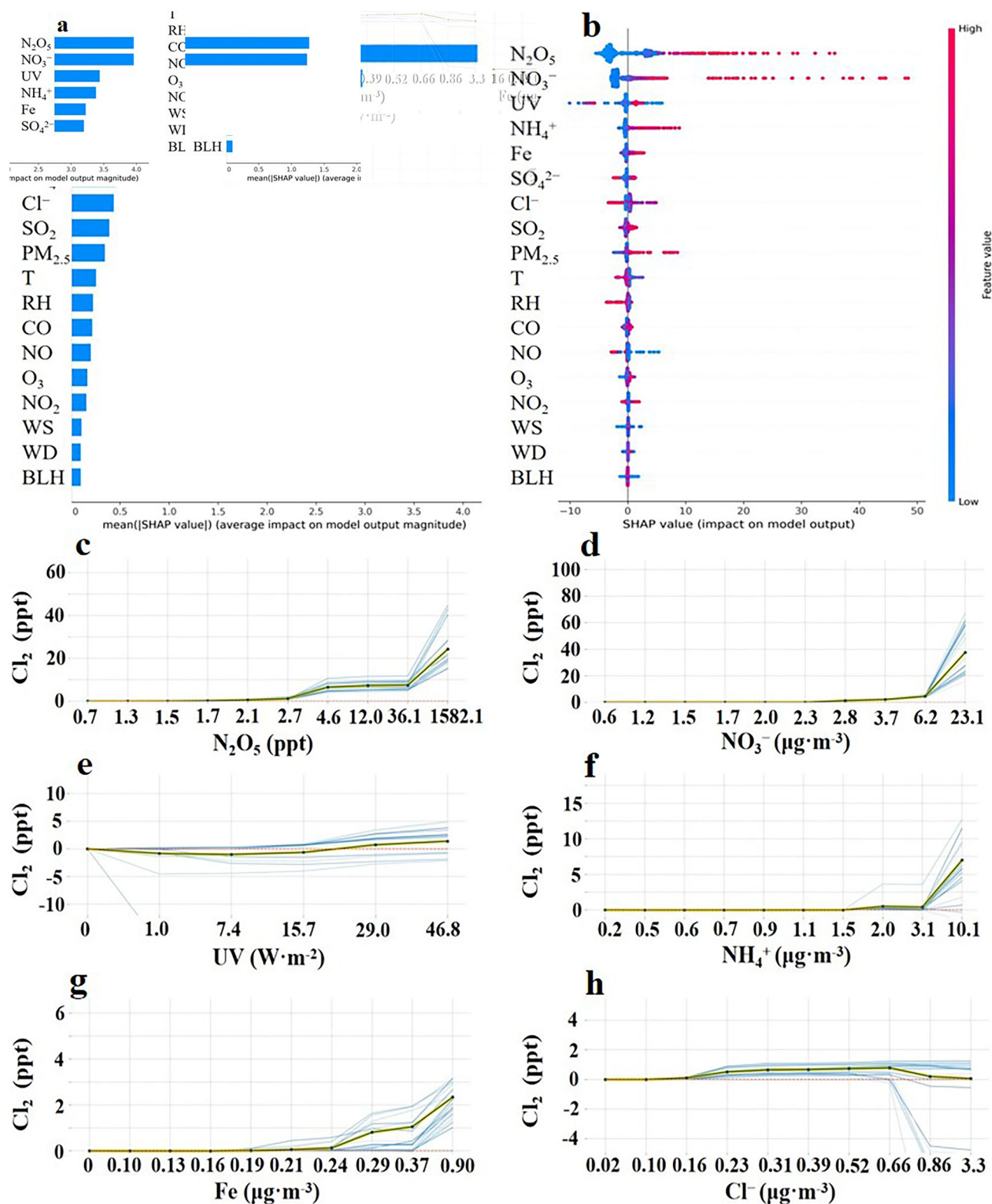
The uptake of  $\text{N}_2\text{O}_5$  contributed limited to daytime  $\text{Cl}_2$  levels due to very low levels of  $\text{N}_2\text{O}_5$  during the daytime (Fig. 1). Beyond  $\text{N}_2\text{O}_5$ , the XGBoost-SHAP model identified  $\text{NO}_3^-$  and UV as critical factors affecting  $\text{Cl}_2$  levels. Moreover, a strong correlation ( $r = 0.58$ ) was observed between a proxy for  $\text{NO}_3^-$  photolysis ( $\text{NO}_3^- \times / \text{NO}_2 \times S_a$ ) and daytime  $\text{Cl}_2$  levels during our measurement period (Fig. 3b). Recent research demonstrated that the photolysis of particulate nitrate under acidic conditions ( $\text{pH} < 3.0$ ) is a source of daytime  $\text{Cl}_2$ , supported by both field observations and laboratory experiments<sup>3</sup>. We employed a thermodynamic equilibrium model (ISORRPIA II) to calculate the aerosol pH at our study site. The average aerosol pH is  $2.3 \pm 0.5$  throughout the observation period, with the lowest values occurring during the daytime (Fig. S2). The results indicate sufficiently

acidic conditions conducive to the generation of daytime  $\text{Cl}_2$  at our study site. Therefore, it is inferred that the photolysis of particulate nitrate accounted for daytime  $\text{Cl}_2$  formation at our study site.

Notably, previous experiment used sodium chloride (NaCl) and sodium nitrate ( $\text{NaNO}_3$ ) as sources of particulate chloride and nitrate, with pH adjusted by sulfuric acid ( $\text{H}_2\text{SO}_4$ )<sup>12</sup>. However, in our study, the significance of  $\text{NH}_4^+$  was highlighted by the XGBoost-SHAP model. Two possible explanations were explored for this. On the one hand, our analysis of chemical correlations revealed a strong positive relationship between  $\text{NO}_3^-$  and  $\text{NH}_4^+$  ( $r = 0.94$ ), while  $\text{NO}_3^-$  showed minimal correlation with  $\text{Na}^+$  (Fig. S3). This correlation pattern indicates that  $\text{NO}_3^-$  formation is predominantly governed by the reaction between  $\text{NH}_3$  and  $\text{HNO}_3$ , rather than through the acid displacement of  $\text{HNO}_3$  on sea salt aerosols. The air mass trajectory analysis further corroborates this conclusion. Consequently, atmospheric  $\text{NO}_3^-$  at our study site exists primarily in the form of ammonium nitrate ( $\text{NH}_4\text{NO}_3$ ) rather than  $\text{NaNO}_3$ . On the other hand, the difference in acidity between  $\text{NH}_4^+$  and  $\text{Na}^+$  is primarily evident in their behavior in water. Sodium salts, such as  $\text{NaNO}_3$ , are generally neutral since  $\text{Na}^+$  does not react with water to change the pH. In contrast, when ammonium salts, like  $\text{NH}_4\text{NO}_3$ , dissolve,  $\text{NH}_4^+$  reacts with water to produce ammonia and hydrogen ions, leading to an acidic solution. Consequently, ammonium salts typically decrease the value of the pH, while sodium salts do not. These results indicated that the photolysis of  $\text{NH}_4\text{NO}_3$  mainly contribute to daytime  $\text{Cl}_2$  generation, compared to that of  $\text{NaNO}_3$ . As shown in Fig. 3c, the elevated concentrations of  $\text{NH}_4^+$  promoted the generation of daytime  $\text{Cl}_2$  by enhancing nitrate photolysis.

In addition to the photolysis of particulate nitrate, aerosol iron photochemistry has been proposed as a major source of daytime  $\text{Cl}_2$ , accounting for over 90% of  $\text{Cl}_2$  generation in North China<sup>20</sup>. In our study, Fe was identified as an important factor for  $\text{Cl}_2$  formation based on the XGBoost-SHAP model. Furthermore, a proxy for aerosol iron photochemistry ( $\text{Fe} \times / \text{NO}_2 \times S_a$ ) correlated well ( $r = 0.61$ ) with daytime  $\text{Cl}_2$  levels during our observation period (Fig. 3d). The results declared that aerosol iron photochemistry also contributed to daytime  $\text{Cl}_2$  production at our study site.

Notably, the elevated Cl levels were associated with higher concentrations of  $\text{Cl}_2$  (Fig. 2h). But once  $\text{Cl}^-$  levels exceeded  $0.66 \mu\text{g}\cdot\text{m}^{-3}$ ,  $\text{Cl}_2$  concentrations tended to decline, likely due to additional limiting factors influencing  $\text{Cl}_2$  production, implying  $\text{Cl}^-$  has not been a limiting factor at that time. Although  $\text{Cl}^-$  typically plays a significant role in the generation of  $\text{Cl}_2$ , in this study, due to the study site located in a coastal area with abundant  $\text{Cl}^-$ , the machine learning results also suggest that  $\text{Cl}^-$  is not the most critical factor influencing  $\text{Cl}_2$  concentrations, with its importance even lower than that of  $\text{SO}_4^{2-}$ . However, this does not imply that  $\text{Cl}^-$  is not important for  $\text{Cl}_2$  formation. Consistent with the previous observation at a coastal site of Hong Kong<sup>3</sup>, their study also found that  $\text{Cl}^-$  is not a key limiting factor for daytime  $\text{Cl}_2$  generation, with factors such as  $\text{NO}_3^-$  and aerosol acidity being the primary controlling variables. The importance of  $\text{SO}_4^{2-}$  likely lies in its relationship with aerosol acidity. As demonstrated in laboratory studies where acidity was regulated by  $\text{H}_2\text{SO}_4$  to validate the process of nitrate photolysis generating  $\text{Cl}_2$ , an aerosol pH level below 3.3 is a critical condition for  $\text{Cl}_2$  formation via nitrate photolysis<sup>3</sup>, highlighting the significance of aerosol acidity for  $\text{Cl}_2$  generation. Studies have shown that the high concentrations of  $\text{Cl}_2$  observed during the daytime are closely related to aerosol acidity, while the absence of high daytime  $\text{Cl}_2$  concentrations in many regions is primarily due to unfavorable aerosol acidity conditions for  $\text{Cl}_2$  formation<sup>3,23</sup>. Therefore, the importance of  $\text{SO}_2$  lies in its regulatory effect on aerosol acidity. Several studies have indicated that reducing  $\text{SO}_2$  emissions can effectively modulate aerosol acidity, thereby mitigating the adverse impacts of reactive chlorine species on the atmospheric environment<sup>3,24,25</sup>. Meanwhile, the influence of  $\text{PM}_{2.5}$  on  $\text{Cl}_2$  is mainly determined by its chemical composition. This study found that aerosol components such as Fe,  $\text{Cl}^-$ ,  $\text{NH}_4^+$ ,  $\text{SO}_4^{2-}$ , and  $\text{NO}_3^-$  all contribute significantly to  $\text{Cl}_2$  generation. The high ranking of these components in terms of factor importance may indirectly reduce the overall importance of  $\text{PM}_{2.5}$ , resulting in  $\text{PM}_{2.5}$  having a slightly lower factor importance compared to  $\text{SO}_2$ .



**Fig. 2 | Key drivers of  $\text{Cl}_2$  formation and loss processes.** The contribution of each factor to the  $\text{Cl}_2$  predictions (a). The distribution of SHAP values for all factors, ranking them by their influence on the predicted  $\text{Cl}_2$  levels (b). The isolated impact of

specific factors on  $\text{Cl}_2$  levels, including  $\text{N}_2\text{O}_5$  (c),  $\text{NO}_3^-$  (d), UV (e),  $\text{NH}_4^+$  (f), Fe (g), and  $\text{Cl}^-$  (h). The yellow and black curves represent the average changes in simulated  $\text{Cl}_2$  levels as the factors vary, while the blue curves illustrate all possible outcomes.

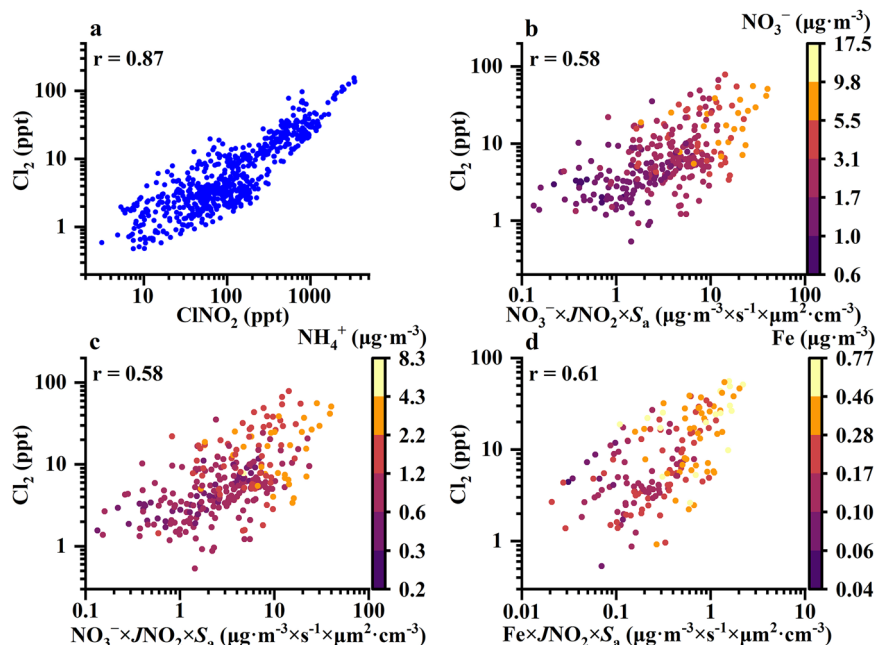
### Photochemical impacts

In this study, the photochemical impacts of  $\text{Cl}_2$  were evaluated using a box model. In contrast to the dominant role of  $\text{ClNO}_2$  photolysis (up to 71%) in the early morning,  $\text{Cl}_2$  photolysis emerged as the primary source of  $\text{Cl}\cdot$  in the afternoon (up to 94%) (Fig. 4a). The  $\text{Cl}\cdot$  generated from  $\text{Cl}_2$  photolysis

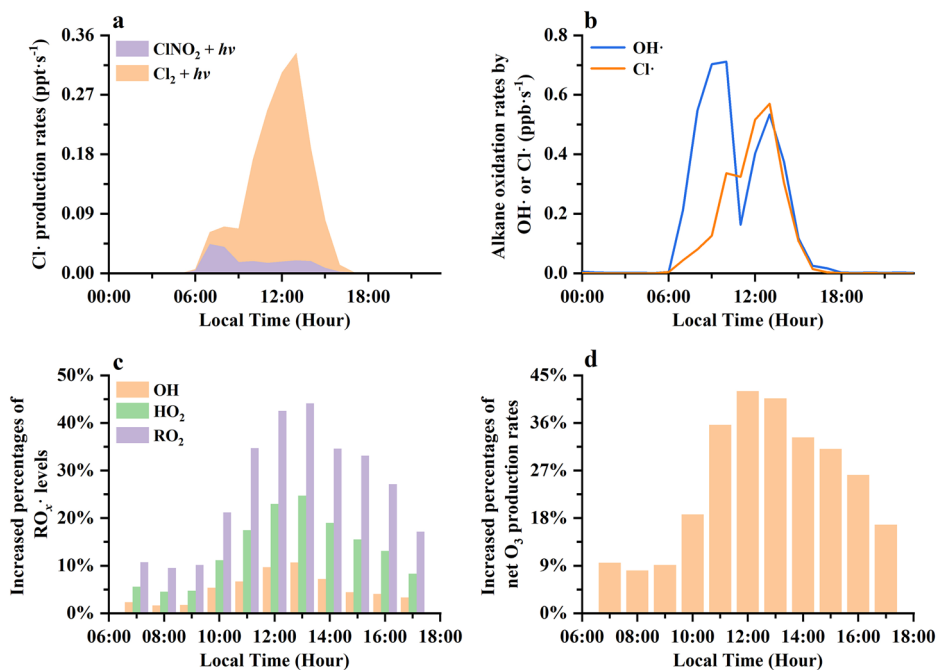
predominantly oxidized alkanes (~60.0%) and oxygenated volatile organic compounds (OVOCs, ~22.2%) (Fig. S4a). Meanwhile, propane, n-butane, and HCHO were the major VOC species oxidized by  $\text{Cl}\cdot$  (Table S3). Compared to other atmospheric oxidants, such as  $\text{OH}\cdot$ ,  $\text{NO}_3$ , and  $\text{O}_3$ ,  $\text{Cl}\cdot$  contributed to as much as 14.5% of total VOC oxidation (Fig. S4b).



**Fig. 3 | Cl<sub>2</sub> production mechanisms.** The relationship between Cl<sub>2</sub> and ClNO<sub>2</sub> during the nighttime (a). The correlation between daytime Cl<sub>2</sub> concentrations (8 a.m.–4 p.m.) and a proxy of nitrate (NO<sub>3</sub><sup>−</sup>) photolysis (NO<sub>3</sub><sup>−</sup> × JNO<sub>2</sub> × S<sub>a</sub>), and the color of the dots denotes the concentrations of NO<sub>3</sub><sup>−</sup> (b) and NH<sub>4</sub><sup>+</sup> (c), respectively. The correlation between daytime Cl<sub>2</sub> concentrations (8 a.m.–4 p.m.) and a proxy of aerosol iron photochemistry (Fe × JNO<sub>2</sub> × S<sub>a</sub>), the color of the dots denotes the concentrations of Fe (d).



**Fig. 4 | The photochemical impacts of Cl<sub>2</sub> on November 19th, 2022.** Cl<sub>2</sub> production pathways (a). Comparison of alkane oxidation rates by OH· or Cl· (b). Increased percentages of OH·, HO<sub>2</sub>·, and RO<sub>2</sub>· with Cl<sub>2</sub> (c). Increased percentages of net O<sub>3</sub> production rates with Cl<sub>2</sub> (d).



Remarkably, around noon, alkane oxidation rates by Cl· exceeded those by OH· (Fig. S5b), mainly related to VOC, Cl·, and OH· concentrations, and their reaction rates with VOC species (Figure S5). Although the concentrations of Cl· are lower than that of OH·, the reaction rates of Cl· with alkanes are higher, particularly for ethane, propane, and n-butane (Table S4).

Cl· released from Cl<sub>2</sub> photolysis oxidized VOCs, facilitating the formation of RO<sub>x</sub> (OH·, HO<sub>2</sub>·, and RO<sub>2</sub>·) radicals and O<sub>3</sub>. In scenarios including Cl<sub>2</sub>, the average concentrations of OH·, HO<sub>2</sub>·, and RO<sub>2</sub>· increased by 5.2%, 13.4%, and 25.9% (Fig. 4c), respectively, compared to those without Cl<sub>2</sub>. Maximum increases in HO<sub>2</sub>· and RO<sub>2</sub>· levels reached 25.0% and 44.0%, greatly enhancing photochemical O<sub>3</sub> production through the reactions of HO<sub>2</sub>· and RO<sub>2</sub>· with NO. Consequently, the average net O<sub>3</sub> production rates increased by 42.0% in the presence of Cl<sub>2</sub> (Fig. 4d).

Previous studies have shown that Cl<sub>2</sub> concentrations typically exhibit either a single daytime peak or a nighttime peak<sup>3,5,11,18</sup>. However, in our study, Cl<sub>2</sub> concentrations displayed a dual-peak pattern during both daytime and nighttime, indicating dual sources of Cl<sub>2</sub> at our study site. Regarding the daytime formation mechanisms, observations from coastal areas in Hong Kong have demonstrated that the photolysis of nitrate significantly contributed to high daytime Cl<sub>2</sub> concentrations<sup>3</sup>. In contrast, observations in the inland city of Nanjing revealed a significant missing source of daytime Cl<sub>2</sub>, which is hypothesized to be related to aerosol iron photochemistry<sup>12</sup>, though direct observational evidence is lacking. For nighttime formation mechanisms, observations of Cl<sub>2</sub> in inland cities such as Nanjing and Beijing have indicated that the heterogeneous processes involving N<sub>2</sub>O<sub>5</sub> are the primary source of nighttime Cl<sub>2</sub><sup>5,18</sup>. Therefore, this

study conducted systematic observations of  $\text{Cl}_2$  in the coastal urban atmosphere of Southeast China, combined with machine learning analysis, not only revealed that both nitrate (particularly ammonium nitrate) photolysis and aerosol iron chemistry contribute to daytime  $\text{Cl}_2$  formation but also confirmed that the heterogeneous processes of  $\text{N}_2\text{O}_5$  dominate nighttime  $\text{Cl}_2$  generation. Additionally, we uncovered the significant role of  $\text{NH}_4^+$  in  $\text{Cl}_2$  formation, an aspect that had not been clarified in previous studies. The  $\text{Cl}$  radicals released from the photolysis of high daytime  $\text{Cl}_2$  concentrations significantly oxidized alkanes, even surpassing the alkane oxidation by  $\text{OH}$  radicals around noon. This process boosts the production of  $\text{RO}_x$  radicals and  $\text{O}_3$ , thereby altering atmospheric oxidation in urban environments of coastal area.

## Methods

### Field measurements

Intensive measurements were carried out at an urban site in Xiamen, a major coastal city in Southeast China, from October 9th to December 5th, 2022. The study site is situated in an urban area, characterized by proximity to river bays, shopping malls, residential zones, and major transportation routes, without the significant industrial activities in the vicinity. Further details about the site are available in our previous studies<sup>26,27</sup>.

$\text{Cl}_2$ ,  $\text{ClNO}_2$ , and  $\text{N}_2\text{O}_5$  were measured using an iodide-adduct Chemical Ionization-Atmospheric Pressure Interface-Long Time of Flight mass spectrometer ( $\text{I}^-$ -ToF-CIMS, Aerodyne Research and ToFwerk AG). The concentrations of these species were calibrated following established protocols<sup>4,13,21</sup>. Specifically, the  $\text{Cl}_2$  permeation tube (98 ng/min, VICI Metronics, Inc.) was used to generate standard  $\text{Cl}_2$  gases.  $\text{N}_2\text{O}_5$  was produced by reacting  $\text{O}_3$  with excess  $\text{NO}_2$ , and  $\text{ClNO}_2$  was synthesized through the reactions of  $\text{Cl}_2$  with sodium nitrite ( $\text{NaNO}_2$ ) and sodium chloride ( $\text{NaCl}$ ). Additionally, the study synchronously monitored trace gases ( $\text{CO}$ ,  $\text{O}_3$ ,  $\text{SO}_2$ ,  $\text{NO}_x$ , and volatile organic compounds (VOCs)), aerosol iron ( $\text{Fe}$ ), ionic compositions in  $\text{PM}_{2.5}$ , aerosol surface area ( $S_a$ ). Meteorological parameters were also observed, including photolysis frequencies (e.g.,  $J(\text{NO}_2)$ ), temperature ( $T$ ), relative humidity ( $\text{RH}$ ), ultraviolet radiation ( $\text{UV}$ ), wind speed ( $\text{WS}$ ), wind direction ( $\text{WD}$ ), and boundary layer height ( $\text{BLH}$ ). The details on the measurement techniques and calibrations are summarized in Text S1, Text S2, and Table S1.

### Machine learning model

In this study, an extreme gradient boosting (XGBoost) model was employed to predict  $\text{Cl}_2$  levels, with the Shapley additive explanations (SHAP) model used for ranking the significance of factors influencing  $\text{Cl}_2$  levels. The integrated XGBoost-SHAP model was utilized to identify key drivers of  $\text{Cl}_2$  formation and loss processes. Variables included meteorological conditions (e.g.,  $T$ ,  $\text{RH}$ ,  $\text{UV}$ ,  $\text{WS}$ ,  $\text{WD}$ , and  $\text{BLH}$ ),  $\text{PM}_{2.5}$  and aerosol compositions (e.g.,  $\text{Fe}$ ,  $\text{Cl}^-$ ,  $\text{NH}_4^+$ ,  $\text{SO}_4^{2-}$ , and  $\text{NO}_3^-$ ), and trace gases (e.g.,  $\text{N}_2\text{O}_5$ ,  $\text{O}_3$ ,  $\text{NO}$ ,  $\text{NO}_2$ ,  $\text{CO}$ , and  $\text{SO}_2$ ). Additionally, the partial dependence plot (PDP) provided a visual representation of each factor's marginal influence on the model's predictions by systematically varying the target feature while holding other features constant. The XGBoost model exhibited strong predictive performance, with the simulated  $\text{Cl}_2$  concentrations closely aligning with the observed concentrations ( $r^2 = 0.87$ , a mean absolute error of 4.2 ppt). Additional details regarding the XGBoost-SHAP model can be found in Text S3.

### The box model

In our study, we utilized an observation-based model (OBM) to evaluate the photochemical effects of  $\text{Cl}_2$ . Based on prior research<sup>14,28</sup>, we employed the Master Chemical Mechanism (MCM, Version 3.3.1) and integrated the established chlorine chemistry mechanisms.  $\text{Cl}_2$  photolysis rates ( $J(\text{Cl}_2)$ ) were determined using the Tropospheric Ultraviolet and Visible Radiation (TUV) model under clear-sky conditions, adjusted based on observed  $J(\text{NO}_2)$  values. A detailed configuration of the box model can be found in our previous studies<sup>29</sup>. The box model was constrained with hourly inputs of  $\text{Cl}_2$ ,  $\text{NO}$ ,  $\text{NO}_2$ , VOCs,  $\text{O}_3$ ,  $\text{SO}_2$ ,  $\text{CO}$ , along with meteorological factors. It then

outputs VOC oxidation rates,  $\text{RO}_x$  ( $\text{OH}$ ,  $\text{HO}_2$ , and  $\text{RO}_2$ ) radical levels, and  $\text{O}_3$  production and loss rates (Text S4), comparing scenarios with and without  $\text{Cl}_2$ .

### ISORROPIA II model

The aerosol pH was calculated using Eq. 1, based on the thermodynamic equilibrium model, ISORROPIA II:

$$\text{pH} = -\log_{10} \frac{1000 * H^+}{ALWC} \quad (1)$$

Here,  $H^+$  represents the hydronium ion concentration per volume of air ( $\mu\text{g}\cdot\text{m}^{-3}$ ), and  $ALWC$  is the aerosol liquid water content ( $\mu\text{g}\cdot\text{m}^{-3}$ ). Inorganic particle compositions in  $\text{PM}_{2.5}$  and related gases were obtained using the Monitor for Aerosols and Gases in Ambient Air (MARGA). The model was constrained by the  $\text{NH}_4^+ - \text{NO}_3^- - \text{Cl}^- - \text{SO}_4^{2-} - \text{Na}^+ - \text{K}^+ - \text{NH}_3 - \text{HNO}_3 - \text{HCl}$  system, along with  $T$  and  $\text{RH}$ . The model setup followed protocols from previous studies<sup>11</sup>. Specifically, the model was run in “forward” mode, with total concentrations (gas + particle) of selected species used as inputs. Particles were considered “metastable”, meaning salts did not precipitate under supersaturated conditions.

### Data availability

No datasets were generated or analysed during the current study.

### Code availability

The codes in this study are available from the corresponding author on reasonable request.

Received: 23 October 2024; Accepted: 25 March 2025;

Published online: 02 April 2025

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## Acknowledgements

This work was funded by the National Natural Science Foundation of China (U22A20578), the guiding project of seizing the commanding heights of “self-purifying city” (NO. IUE-CERAE-202402), the Science and Technology Department of Fujian Province (2022L3025), the National Key Research and Development Program (2022YFC3700304), STS Plan Supporting Project of the Chinese Academy of Sciences in Fujian Province (2023T3013), and Xiamen Atmospheric Environment Observation and Research Station of Fujian Province.

## Author contributions

G.C. and J.C. designed the research together. G.C. analyzed data and wrote the manuscript. J.C. provided support for the research and revised the manuscript. X.F. help to perform the observation. X.F., Z.L., X.J., Z.C., and L.X. contributed to the discussion of research.

## Competing interests

The authors declare no competing interests.

## Additional information

**Supplementary information** The online version contains supplementary material available at <https://doi.org/10.1038/s41612-025-01022-y>.

**Correspondence** and requests for materials should be addressed to Jinsheng Chen.

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