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# Identification of the roles of urban plume and local chemical production in ozone episodes observed in Long Island Sound during LISTOS 2018: Implications for ozone control strategies

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#### ABSTRACT

Long Island Sound (LIS) frequently experiences ozone (O<sub>3</sub>) exceedance events that surpass national ambient air quality standards (NAAQS) due to complex driving factors. The underlying mechanisms governing summertime O<sub>3</sub> pollution are investigated through collaborative observations from lidar remote sensing and ground samplers during the 2018 LIS Tropospheric O<sub>3</sub> Study (LISTOS). Regional transport and local chemical reactions are identified as the two key driving factors behind the observed O<sub>3</sub> episodes in LIS. An enhanced laminar structure is observed in the O<sub>3</sub> vertical structure in the atmospheric boundary layer (i.e., 0-2 km layer) for the case dominated by regional transport. An O<sub>3</sub> formation regime shift is found in ozone-precursor sensitivity (OPS) for the O<sub>3</sub> exceedance event dominated by regional transport with NO<sub>x</sub>-enriched air mass transport from the New York City (NYC) urban area to LIS. Furthermore, the Integrated Process Rate (IPR) analysis demonstrates that transport from the NYC urban area contributed 40% and 27.1% of surface O<sub>3</sub> enhancement to the case dominated by regional transport and local production, respectively. This study provides scientific evidence to uncovers two key processes that govern summertime O<sub>3</sub> pollution over LIS and other similar coastal areas.

#### 1. Introduction

 $O_3$  is a secondary pollutant generated by a series of photochemical reactions involving volatile organic compounds (VOCs) and nitrogen oxides (NO<sub>x</sub>) under the favorable meteorological conditions such as strong solar radiation. Elevated levels of ambient O<sub>3</sub> have adverse effects on human health and vegetation growth (Westervelt et al., 2019; Zelm et al., 2016), as well as play a critical role in atmospheric chemistry (Verstraeten et al., 2015). The processes of constraining surface O<sub>3</sub> concentrations are extremely complex, and the complexity can be even higher in coastal megacities like New York. Therefore, quantifying the contributions of key processes continues to represent a great interest to the air quality research community and policy makers (Benjamin and Peter, 2011; Lin et al., 2012; Zheng et al., 2018).

Photochemical production and regional transport are critical to development of  $O_3$  episodes (Verstraeten et al., 2015; Zhao et al., 2021a, b). Photochemical production heavily relies on the emissions of  $O_3$  precursors. such as VOCs and  $NO_x$ , as well as their ratios (VOCs/NO<sub>x</sub>).  $O_3$  formation regimes can be further described using ozone-precursor sensitivity (OPS). Previous studies have shown that inappropriate emission control strategy could lead to an unexpected  $O_3$  enhancement due to  $O_3$ -precursor nonlinearity (e.g., Ou et al., 2016; Xu et al., 2022). Regional transport is another important source accounting for the enhancement of surface  $O_3$  (Derwent et al., 2004; Zhao et al., 2022). The  $O_3$  precursors can be transported from highly polluted urban areas to downwind locations. Such urban plume can exacerbate the severity of air pollution and modify the VOC/NO<sub>x</sub> ratios, making the air pollution chemistry even more complex (Zhao et al., 2022). Both chemical

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production and transport are strongly influenced by meteorological conditions, such as strong solar radiation, high temperature, atmospheric boundary conditions, and winds (Liu et al., 2020; Zhao et al., 2019; Zhu and Liang, 2013). Extensive studies have demonstrated that both  $O_3$  and its precursors can be transported horizontally or vertically, from upstream areas or the lower free troposphere, resulting in elevated  $O_3$  level and  $O_3$ -precursor nonlinearity (Cooper et al., 2010; Luo et al., 2020; Zhao et al., 2021a,b; Zhao et al., 2022). Therefore, it is important to consider these processes when formulating anthropogenic emission control strategies to effectively mitigate  $O_3$  NAAQS exceedance events.

New York City (NYC) is a coastal megacity with a population of more than 23.8 million people living in an area of nearly 35,000 km<sup>2</sup>. Due to its strong anthropogenic emissions and coastal weather accompanied by land-sea breezes, it is more susceptible to O<sub>3</sub> pollution than other cities or regions (Karambelas, 2020; Ninneman et al., 2020; Zhang et al., 2020; Han et al., 2022). During summer months, O<sub>3</sub> exceedance events are frequently observed in NYC and its downwind coastal regions in Connecticut and Long Island. To understand O<sub>3</sub> pollution episodes in this region, the Long Island Sound Tropospheric O3 Study (LISTOS) provided an excellent opportunity to explore the underlying mechanisms behind the O<sub>3</sub> episodes over LIS (Miller, 2017; Karambelas, 2020). Extensive measurements were conducted between June and September 2018 within the NYC metropolitan area and over Long Island Sound (LIS), including research aircrafts, O3 lidars, wind-profiler, ceilometers, and surface in-situ observations. The LISTOS study revealed large spatial gradient variations of surface O3 near the land-water interface, which were influenced by sea breeze during the study period (Zhang et al., 2020).

The causes of air pollution episodes in the NYC area have been investigated using numerical models and observations from the LISTOS field campaign. Studies by Couillard et al., (2021), Judd et al., (2020), Wu et al., 2021, Zhang et al., (2020) have identifiedland-water breezes, low-level jet, and regional transport as the primary factors contributing to  $O_3$  enhancements. Han et al. (2022) further showed that sea breezes made dramatic impacts on ozone patterns in the NYC area. Torres-Vazquez et al. (2022) found that sound breezes and low-level jets play an important role in the transporting urban emissions and pollutants to the marine boundary layer in LIS and the coastal areas. Coggon et al. (2021) highlighed that the large impacts of volatile chemical products (VCPs) emissions in NYC on O3 enhancement during heat waves. Additionally, Tao et al. (2022) investigated changes in O<sub>3</sub> formation chemistry using observed tropospheric column NO2 and formaldehyde (HCHO) from satellite, airborne, and ground measurements in May-August 2018. Their findings suggest a transition toward a more NO<sub>x</sub>-sensitive photochemical environment during high-ozone days in the NYC area.

In this study, Weather Research and Forecasting/Chemistry (WRF-Chem), version 3.9.1 is utilized to simulate the spatial and temporal characteristics of  $O_3$  episodes with a fine grid spacing of 1.3 km. Ma et al. (2021) demonstrated that high-resolution simulations can improve the performance of air quality model in simulating high  $O_3$  episodes. A variety of observational data from the LISTOS field campaign are used to better understand the mechanisms governing the  $O_3$  episodes during Aug.5–9, 2018 over LIS. Two representative  $O_3$  pollution events are presented to quantify the relative roles of regional transport and local photochemical production in their occurrences. The specific objectives of the study are to 1) quantify the contributions of individual processes to surface  $O_3$  enhancement of two different types of  $O_3$  exceedance events, 2) conduct a comprehensive assessment on the key driving factors governing the  $O_3$  episodes over LIS, and 3) determine the changes in OPS over time and relate the changes to emission reduction strategies.

#### 2. Methodology

#### 2.1. Modeling system

The WRF-Chem version 3.9.1 was applied in this study. Three nested

domains are employed in the simulations at grid-spacing of 13 km, 4 km, and 1.33 km with grid points of  $110 \times 85$ ,  $100 \times 73$ , and  $88 \times 61$  from the outermost domain (D1) to the innermost domain (D3), respectively (Fig. 1). The study focused on three surface O<sub>3</sub> monitoring sites in the coastal area of LIS: Westport, Flax Pond, and Eaton Neck. LIS is located at the northeast of NYC, the downwind area of NYC as the southwest winds prevail in NYC. Forty-six vertical layers from surface to the 50-hPa level were used with the lowest vertical layer about 40 m above the ground layer. All the physics parametrization schemes and the nudging configuration used in this study are the same as those used by Zhao et al. (2019). Atmospheric chemistry was simulated by the Regional Acid Deposition Model Version 2 (RADM2) (Stockwell et al., 1990). Details of the model configurations are provided in the Supplementary Material (Table S1).

The Final Operational Global Analysis data (FNL) with 1° horizontal resolution and 27 vertical levels from the surface to the 10-hPa level are used to generate initial and lateral boundary meteorological conditions to drive the WRF-Chem simulations. The Model for Ozone and Related Chemical Tracers Version 4 (MOZART-4/GEOS5) (Emmons et al., 2010) products are used to provide chemical initial and lateral conditions to the model simulations. Anthropogenic emissions from point, on-road mobile, non-road mobile, and area sources with a 4-km spatial resolution are provided by the 2014 National Emissions Inventory (NEI) developed by the U.S. Environmental Protection Agency (EPA) (Couillard et al., 2021; Judd et al., 2020; Wu et al., 2021; Zhang et al., 2020). Biogenic emissions are calculated using the Model of Emissions of Gases and Aerosols from Nature v2.1 (MEGAN) (Guenther et al., 2012). The land-use categories and distribution of NO<sub>x</sub> and VOCs emissions over the NYC and LIS are depicted in Fig. 1 and S1. It is clear that the NYC metropolitan area was an important source of NO<sub>x</sub> emissions contributed by human activities including traffic and industry, indicating a VOC-limited regime for emissions in NYC. On the other hand, as a suburban area, LIS has much less NO<sub>x</sub> emissions but more isoprene emissions. When the prevailing wind was dominated by southwesterly, O3 and its precursors were transported from NYC to LIS, exacerbating O3 pollution and modifying the VOC-to-NO<sub>x</sub> ratios and OPS.

Integrated Process Rates (IPR) is performed to quantify the relative contributions of physical processes and chemical reactions to the changes in  $O_3$  concentrations during the events (Zhao et al., 2022). The changes in concentrations by individual processes are calculated at each integration time step and grid point throughout the simulations.

The ratio  $O_3/NO_y$  was proposed by Milford et al. (1994) as an indicator to represent  $O_3$  formation potential. Since then, it has been widely used in modeling and observational studies to determine  $O_3$  formation regimes (Liu et al., 2010; Sillman and He, 2002). According to the previous studies, areas with a ratio greater than 7 are characterized by  $NO_x$ -limited regime and otherwise defined as VOC-limited (Sillman and He, 2002).

#### 2.2. Observational data

To improve understanding of  $O_3$  formation over LIS, a large coordinated measurement campaign was carried out through joint collaboration among state and federal agencies and university research groups in the summer of 2018 LISTOS (https://www.nescaum.org/documents/listos). As listed in Table 1, a host of measurements were conducted to identify the relative roles of photochemical reactions and meteorological conditions during the  $O_3$  exceedance events.

Hourly surface observations such as air temperature, relative humidity, wind speed, wind direction, and air quality data were collected synchronously at five sites across the NYC and surrounding regions. The information about the sites and the measured variables can be found from Fig. 1 and Table 1. During the campaign, surface  $O_3$  was routinely measured at the Air Quality Stations (CCNY, Flax Pond, Westport) operated by the US Environment Protection Agency (EPA), with a measurement uncertainty of approximately  $\pm$  4 ppbv, as indicated by



Fig. 1. Settings of three domains in WRF-Chem modeling system and meteorological and air quality sites in the NYC and Long Island areas. Detailed land-use categories are as follows: 1: evergreen needleleaf forest; 2: evergreen broadleaf forest; 3: deciduous needleleaf forest; 4: deciduous broadleaf forest; 5: mixed forest; 6: closed shrublands; 7: open shrublands; 8: woody savannas; 9: savannas; 10: grasslands; 11: permanent wetlands; 12: croplands; 13: urban and built-up land; 14: cropland/natural vegetation mosaic; 15: snow and ice; 16: barren or sparsely vegetated; 17: water; 18: wooded tundra; 19: mixed tundra; and 20: barren tundra.

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A Summary of monitoring sites locations and data used in this study.

Site	Latitude (North)	Longitude (West)	Measured variable	Elevation (AGL)	Measurement
Eatons Neck	40.95°	73.4°	O <sub>3</sub> , Attenuated backscatter	5 m	Surface O <sub>3</sub> observation, ceilometer
CCNY	40.82°	73.95°	O3, NO2 Attenuated backscatter	15 m	Surface air quality and meteorological observation
Flax Pond	40.96°	73.14°	O <sub>3</sub> , NO <sub>x</sub> ,	4 m	Surface air quality observation
NYBG	40.86°	73.88°	O <sub>3</sub>	15 m	Surface air quality observation
Queens College	40.73°	73.82°	O <sub>3</sub> , NO <sub>x</sub>	5 m	Surface air quality observation
Westport	41.12°	73.34°	O <sub>3</sub> and wind profile	3 m	Surface air quality observation, $O_3$ Lidar, wind lidar

zero drift during 12–24 h duration (Duvall et al., 2021). The Model 202/ 205 Dual Beam Ozone Monitor (2B-Tech) was used to measure  $O_3$  at Eatons Neck with a precision of 1.0 ppb (https://www.twobtech.com /model-205-ozone-monitor.html). It has been approved by the EPA as a Federal Equivalent Method (FEM). However, the TAPI Model 500U sensor overestimates NO<sub>2</sub> by approximately 10% due to the conversion of total odd nitrogen to NO by molybdenum oxide catalysts (McClenny et al., 2002).

Various remote sensing instruments were used to characterize vertical distributions of attenuated backscatter, wind speed and direction, and  $O_3$ . These instruments include the Vaisala CL-51 and CL-31 ceilometers, the Leosphere WindCube 200S coherent Doppler wind lidar, City College of New York (CCNY) aerosol lidar, and the NASA Langley Mobile  $O_3$  Lidar (LMOL).

The ceilometer measured the attenuated backscatter at a laser wavelength of 910 nm with 10 m  $\times$  770 samples a data collection interval of 15 s, which can be used to determine the planetary boundary layer height (PBLH). A wavelet covariance transforms (WCT) method was used to calculate the PBLH based on vertical gradient variation of aerosol backscatter profiles (Gan et al., 2011). The PBLH was determined by locating sharp gradient or minimum gradient in the ceilometer-measured attenuated backscatter profiles. The uncertainty stems from the signal noises, aloft aerosol layer and low-level cloud, thus a quality control and quality assurance (QA/QC) process is applied to remove those outliers (Münkel, et al., 2011). Besides, a coherent Doppler Wind Lidar (WindCube 200s) was installed in Westport (West coast of Long Island Sound) to measure wind profiles with a range-gate spacing of 25-50 m and a sampling frequency of 10 s. A vertically pointing eye-safe laser (wavelength 1.54 µm with a repetition rate of 10 kHz) was used to measure wind velocity and direction (Brotzge et al., 2020). The precision of the wind profile is in the range of  $0.2 \text{ m} \cdot \text{s}^{-1} \cdot 0.5$ m•s<sup>-1</sup> (Brotzge et al., 2020). The NASA Langley Mobile Ozone Lidar (LMOL) was deployed at Westport to measure O3 vertical structure using

the differential absorption principle at the UV wavelength pair of 287 and 292 nm (De Young et al., 2017). The O<sub>3</sub> profiles were retrieved with a 5–10 min average from LMOL (Gronoff et al., 2019). The LMOL shows great agreement with the ECC ozonesondes, with an overall mean bias of 1–4 ppbv for the altitude range 3–10 km (De Young et al., 2017). Hourly-averaged O<sub>3</sub> profiles were used to evaluate the WRF-Chem predictions of O<sub>3</sub>. Overall, the synergistic use of ceilometer, wind lidar, and O<sub>3</sub> lidar observation provided a unique opportunity to verify the model performance and better understand the underlying mechanisms governing the O<sub>3</sub> episodes over LIS.

#### 3. Result and Discussion

#### 3.1. General characteristics of O<sub>3</sub> episode in August 2018

The time series of hourly averaged  $O_3$  concentrations at CCNY, Flax Pond, and New York Botanic Garden (NYBG) are presented in Fig. S2. The hourly maximum  $O_3$  reached 85.0 ppbv on Aug. 6 and 86.8 ppbv on Aug. 8. Fig. S3 illustrates a time series comparison of observed 2-m temperature, relative humidity, wind speed, and wind direction at the site CCNY (see the locations in Fig. 1 and Table. 1) on Aug. 5–9, 2018. During this period, the hourly-average maximum temperature was above 32.5 °C in the NYC areas, which met the heatwave definition criteria (Robinson, 2001; https://www.weather.gov/okx/excessiveheat ). As illustrated in Fig. S3d, the prevailing wind direction was southwest with a wind speed range of 2–5 m s<sup>-1</sup> which transported air pollutants from NYC areas to the LIS.

 $O_3$  episodes are generally associated with the favorable synoptic systems (Zhang et al., 2020; Zhao et al., 2021a,b). On Aug. 6, a high-pressure system centered in the Atlantic Ocean and a low-pressure system located northeast of the high-pressure system(Fig. 2a) resulted in southwest winds with relatively high wind speed(i.e., 10 m/s), due to the large pressure gradient between these two systems (Fig. S6). In NYC,



Fig. 2. Surface weather charts at 07 EST on (a) 5, (b) 6, (c) 7, (d) 8, (e) 9, Aug. 2018 (yellow triangle: New York City) (https://www.wpc.ncep.noaa.gov/archives/ web\_pages/sfc/historic\_sfc\_archive.php). (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)

the daily maximum temperatures reached 35.0 °C (Fig. S3). At the same time, a low pressure system and a high pressure system were observed over Atlantic Ocean and over Pennsylvania, respectively. The prevailing winds were southwesterly, facilitating horizontal O<sub>3</sub> transport from NYC to LIS. On Aug. 8, a quasi-stationary front approached LIS from the northwest, accompanied by high temperatures, weak wind speed, and strong sunlight, which were conducive to local photochemical reaction and accumulation. Owing to weak background winds (i.e., 6 m/s), regional transport played a minor role in O<sub>3</sub> pollution, which was mainly controlled by local photochemical production (Fig. S9). On Aug. 9, the transverse trough shaped vertically and the center of the low-pressure moved northward, resulting in LIS being located behind a cold front

and experiencing heavy precipitation.

#### 3.2. Two representative $O_3$ enhancement episodes

Two significant  $O_3$  exceedance events were observed with the 1–5 min averaged  $O_3$  concentrations exceeding 98.2 ppbv on Aug. 6 and 115.2 ppbv at Westport on Aug. 8, 2018, respectively. The MDA8  $O_3$  reached 77.5 ppbv on Aug. 6 and 85.0 ppbv on Aug. 8, exceeding the NAAQS for  $O_3$ . As depicted in Fig. 3, a remarkable difference in  $O_3$  diurnal characteristics between these two days was noticed.

A bimodal structure was observed at all sites, with twin peaks appearing at 12:00–14:00 and 16:00–18:00 Aug. 6, 2018. In particular,



Fig. 3. O<sub>3</sub> concentration (1–5 min average) at the ground stations in NYC and LIS areas on (a) Aug. 6 (b) Aug. 8, 2018 (1-min Ave at Westport, Flax Pond, and CCNY, 5-min Ave at Eatons Neck).

at the Westport site, three O<sub>3</sub> peaks were observed at 13:00, 16:00 and 18:00 EDT, respectively. A time lag of approximately one hour between these four sites were observed for the second peak time, indicating an impact of cloud and regional transport. As shown in Fig. S4, a low-level cumulus was observed at 1.8 km on Aug. 6, which attenuated solar radiation and changed the diurnal structure of O<sub>3</sub>, resulting in the low value at 13:00-14:00 EDT. The Satellite MODIS (Terra, 14:30 UTC overpass time, and Aqua, 18:03 UTC overpass time) RGB images on Aug. 6, 2018, clearly indicate the broken clouds in the NYC area (Fig. S5). The second peak O3 value occurred at 18:00-20:00 EDT, when photochemical reactions tended to be inactive but wind velocity exceeded 8 m/s (Fig. S6), indicating the impact of regional transport. On the other hand, surface O3 exhibited a unimodal pattern with its peak at 15:00-16:00 EDT on Aug. 8, following the solar radiation variation pattern, and a minimum value between 0600 and 0700 LST due to NO titration effect, suggesting that the O<sub>3</sub> episode was dominated by local photochemical reactions.

To investigate the two representative  $O_3$  episodes further, we compared  $NO_x$  simulations at the first model level (about 40 m above ground level) with air quality measurements near surface to evaluate the model performance (see Fig. 4). As indicated by the dash blue boxes, the  $NO_x$  level on Aug. 6 was much higher than that on Aug. 8 at 07:00 EDT (58.0 ppbv vs. 41.2 ppbv at Queens College and 15 ppbv vs. 10 ppbv at Flax Pond). Since the local emission intensity was relatively stable on consecutive days, the elevated  $NO_x$  levels, as an important sources of  $O_3$  precursors, can be transported from urban to the downwind areas. Higher amounts of  $NO_x$ , as a critical  $O_3$  precursor, favor the transition of OPS from  $NO_x$ -limited to VOC-limited.

The model had a good performance in NO<sub>x</sub> simulation, with correlation coefficient (R) of 0.68 at Queens College and 0.85 at Flax pond. A comparison of observed versus simulated O3 concentrations in the three sites is also shown in Fig. S2, and a statistical evaluation of O3 simulation is presented in Table S2. Overall, the model exhibited good simulation performance of hourly O<sub>3</sub> at these sites during the O<sub>3</sub> episode, with R of 0.84–0.92, RMSE of 4.6–10.3 ppbv, and MB of –0.8–5.3 ppbv. The uncertainties of O3 precursor emissions could be one of main reasons for the underprediction of the O<sub>3</sub> peak. For instance, the lower simulated NO concentration weakened the NO titration, which led to the over-prediction of O<sub>3</sub> during the nighttime. Coggon et al. (2021) also reported that volatile chemical products (VCPs) emissions in NYC exerted large impacts on O3 simulation. We also make a comparison of simulated surface temperature, relative humidity, wind speed, wind direction with observations at CCNY during Aug. 5-9, 2018, as shown in Fig. S7. The statistical evaluation of simulated surface meteorological variables is listed in Table S3. Overall, the model was able to capture diurnal variation of surface meteorological variables, but underestimated temperature peak levels and overestimated wind speed, which



, the resolution and a vertical resolution that ranges from 50 m near the ground to 1 km at maximum altitude utilizing an adaptive resolution

ground to 1 km at maximum altitude, utilizing an adaptive resolution scheme (Gronoff et al., 2021). The vertical height covers a range from 100 m above ground level (AGL) to middle troposphere. To evaluate the model performance, the original lidar data was interpolated to 21 model levels in the range of 6.2–7000 m and then averaged on an hourly basis. Fig. **5a–b** depict the time-height cross-sections of observed and

simulated  $O_3$  at Westport, a coastal site along LIS, respectively. Due to the UV light from the Sun, the lidar signal was noisy during noon local time, which prevented the retrieval of  $O_3$  at altitudes above approximately 4 km, as shown by the lack of data above these altitudes in Fig. 5a. Howver, despite this limitation, the WRF-Chem model was able to reproduce the diurnal variations of  $O_3$  vertical distributionwell.

As discussed above, the observational data reported severe surface O<sub>3</sub> pollution on Aug. 6, with multi-peak diurnal variations, indicating the potential impact of regional transport (Fig. 3a). The time-height cross-section in Fig. 5a provides further insightes into the  $O_3$  distrubiton, showing a significant O<sub>3</sub> enhancement layer with concentrations of 60  $\sim$  100 ppbvbetween surface and 2 km, gradually increasing from 13 EDT to 19 EDT. The blue box in Fig. 5c highlights the strong vertical wind velocity detected by Doppler wind lidar, which exceeded -1.5 m/s from 15 EDT to 19 EDT, facilitating the vertical transport of  $O_3$ from the upper level. The strong backscatter signal indicates that the aerosol plumes were transported from the free atmosphere (2.5 km AGL) downward to the surface layer, aggravating the surface air pollution (Fig. 5d). However, a low-level cumulus was observed by the ceilometer at 4 km AGL from 15 EDT to 16 EDT on Aug. 6, significantly reducing the solar radiation reaching the surface and weakening the local O<sub>3</sub> photochemical reactions.

The vertical distributions of horizontal wind speed and direction measured by Doppler wind lidar during 18 EDT-20 EDT are shown in Fig. S6. A low-level jet (LLJ) was observed at the height of about 1.5 km AGL after 18 EDT which is responsible for the subsidence area shown in Fig. 5c. The high southwest wind speed (greater than 8 m/s) would led to the O<sub>3</sub>-enriched air aloft being entrained from the residual layer down to the surface layer. Meanwhile, another strong wind band was noticed above the ground. Such a strong jet stream was conducive to O<sub>3</sub> dispersion and sedimentation, leading to the attenuation of surface O<sub>3</sub>. Therefore, the lidar-observed O<sub>3</sub> enhancement at Westport was possibly associated with regional transport and road transport from the NYC urban area.

Apart from regional transport, photochemical reactions are another factor driving  $O_3$  formation. At 10 EST, the hourly maximum  $O_3$  reached 55.0 ppbv (Fig. 6a). As solar radiation increased, the  $O_3$  enhancement area developed as a southwest-northeastern band along the coastal region, with the  $O_3$  maximum center located at LIS at 14 EST (Fig. 6b). A

Fig. 4. A comparison of observed with simulated hourly  $NO_x$  concentrations at the ground stations in NYC (QC) and LIS (Flax Pond) areas during Aug. 5–8, 2018.

may lead to under-predictions of the daytime O<sub>3</sub> peaks.

In summary, the biases in  $O_3$  predictions could be attributed to by a variety of factors such as inaccuracies in anthropogenic emissions inventories (Zhao et al., 2022), biogenic emissions (Zhao et al., 2019), meteorological fields (e.g., PBLH, eddy diffusivity, winds, clouds, temperature), dry deposition (Shen et al., 2011), gas-phase chemical mechanisms (Gupta and Mohan (2015), chemical initialization constraint (Ma et al., 2021), and model resolution (Torres-Vazquez et al., 2022), etc.

#### 3.3. Mechanisms governing the $O_3$ episodes over Long Island Sound

As discussed in the previous section, the two representative cases were dominated by regional transport and local photochemical reactions, respectively. In this section, we further investigate the underlying mechanisms that were responsible for these two  $O_3$  episodes observed over LIS.

The NASA LMOL was used to measure O<sub>3</sub> with a 10-min temporal

#### 3.3.1. Case A on August 6: Dominated by regional transport



Fig. 5. Time-height cross sections of (a) observed, (b) simulated  $O_3$  ( $O_3$ , ppbv), (c) observed vertical wind velocity ("+" upward wind, "-" downward wind) at Westport, (d) ceilometer-measured attenuated backscatter (km<sup>-1</sup>·sr<sup>-1</sup>) at Eatons Neck, New York state, on Aug. 6, 2018.



**Fig. 6.** WRF-Chem's predictions (a,b) surface  $O_3$  and (c,d)  $O_3$ /NO<sub>y</sub> at 10:00 EST and 14:00 EST on 06, Aug, 2018. The studying area is highlighted in red boxes. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)

large amount of  $NO_x$  was transported to LIS and the concentration was elevated to 58 ppbv at Queens College and 15 ppbv at Flax Pond (Fig. 4).

As mentioned earlier, regional transport of  $\mathrm{NO}_{\mathrm{x}}$  may potentially impact OPS. This motivates further characterization of OPS variations

during this event. The spatial distribution of OPS was investigated using  $O_3/NO_y$ , a widely-used indicator (Liu et al., 2010; Sillman and He, 2002). A comparison of simulated vs. observed hourly  $NO_y$  at Flax Pond is presented in Fig. S8, and the statistical parameters are provided in

Table S4 to evaluate the model performance. Overall, the model had a reasonable performance in simulating NOv with correlation coefficient (R) of 0.58 and mean bias (MB) of 3.6 ppb. In comparison with simulated  $O_3$ , the ratios of  $O_3/NO_v$  on Aug. 6, which were lower than 5, agreed well with the O<sub>3</sub> enhancement area, indicating that O<sub>3</sub> formation was dominated by the VOC-limited regime over the NYC and LIS areas (Fig. 6c,d). Compared to LIS, high vegetation coverages were noticed in central and eastern LIS, which would emit a large amount of biogenic VOCs such as isoprene and monoterpene, important precursors of O<sub>3</sub> formation. With the increase in NO<sub>x</sub> concentration, the NO<sub>x</sub>-limited regime transitioned to VOC-limited and O3 mixing ratio increased sharply in response to NO<sub>x</sub> enhancement. Our analysis highlighted that the regional transport not only increased the O3 level but also strengthened the chemical reactions by decreasing the VOC-to-NO<sub>x</sub> ratio, leading to variations in OPS. Thus, it is necessary to consider the impact of long-range transport on OPS from neighboring cities for refining O<sub>3</sub> control strategy.

#### 3.3.2. Case B on Aug 8: Dominated by local chemical production

Another severe  $O_3$  episode with the highest hourly  $O_3$  exceeding 90 ppbv at both sites was observed on Aug. 8. The typical single peak structure of O<sub>3</sub> and relatively lower NO<sub>x</sub> level suggest a dominate role of local photochemical reactions in the development of the episode (Fig. 3b and 4).

A pool of O<sub>3</sub> with a concentration greater than 80.0 ppbv was observed through O3 lidar below 1.5 km altitude (Fig. 7a). The simulated O<sub>3</sub> showed very good agreement with the lidar observation below 2 km, but slightly underestimated the peak O<sub>3</sub> levels (Fig. 7b). Hourlyaveraged O<sub>3</sub> reached 91.4 ppbv at 1.1 km altitude from 15 to 17 EDT, which exceeded the NAAQS for O3. The time-height cross-section shows a peak of O<sub>3</sub> in the boundary layer at noon, coinciding with the daily maximum solar radiation. This is mainly due to local photochemical production and transport of O3 from the NYC urban area. After 18 EDT, a layer with O3 concentration higher than 80.0 ppbv remained at the height of 1 km above ground level, indicating that the local chemical production played a significant role in the exceedance of NAAQS for O<sub>3</sub>.

Fig. 7c presents a time-height cross-section of vertical wind speed

measured by the Doppler wind lidar. Ascent motions were observed at 15 EDT, 16 EDT, and 19 EDT, which contributed to the formation of a high-O3 layer at 1 km. In contrast, at 18 EDT, a strong subsidence movement was observed, indicated by negative vertical wind speed (vertical velocity < -1.5 m/s). The subsidence movement was caused by a strong southwest jet (wind velocity greater than 10 m/s) located between 1.5 and 2 km (Fig. S9), resulting in the O<sub>3</sub>-enriched air mass descending from the 7 km to 1 km with O<sub>3</sub> concentrations reaching 60.0 ppbv at 18 EDT (Fig. 7b). Fig. 7d shows the spatiotemporal variations of the attenuated backscatter at Eatons Neck. The low-level clouds at 1.5 km significantly reduced the solar radiation, leading to a decrease in surface O<sub>3</sub> after 18 EDT.

A similar O3 hot-spot pattern along southwest-northeast direction was noticed with 10 ppbv higher than that on Aug. 6 (Fig. 8a,b). The hourly  $O_3$  concentration had increased by 10–20 ppbv during 10–14 EST. OPS achieved a relatively high O<sub>3</sub>/NO<sub>v</sub> ratio (i.e., 15), indicating the  $NO_x$ -limited regime of  $O_3$  formation at LIS (Fig. 8c,d). This is consistent with the fact that Long Island was well covered vegetation and NO<sub>x</sub> emissions were low, the regional transport may only marginally contribute to the O<sub>3</sub> enhancement.

Overall, both O<sub>3</sub> and O<sub>3</sub> precursors (i.e., VOCs and NO<sub>x</sub>) can be transported from the NYC urban area to LIS. The O3-enriched air transported from NYC could exacerbate O<sub>3</sub> pollution over LIS. Meanwhile Long Island has a higher vegetation coverage than NYC, which leads to higher emissions of isoprene and monoterpene (Geng et al., 2011). Thus, LIS was dominated by the NOx-limited regime. In comparison, NO<sub>x</sub> emissions were emitted from power plants, transportation, and fossil fuel combustion activities over the NYC. As a result, NOxenriched air transported from NYC could decrease the VOC-to-NO<sub>x</sub> ratio, thus shifting the OPS toward the VOC-limited regime.

As OPS varies with different scenarios, we recommend a dynamic O<sub>3</sub> control strategy for LIS with priority given to controlling either VOC or NO<sub>x</sub> emission sources depending on which factor dominates. When the NO<sub>x</sub>-enriched air is transported to LIS, a VOC-focused strategy is recommend to effectively lower the O<sub>3</sub> levels. In contrast, NO<sub>x</sub> emission reduction should be prioritized when the local photochemical reactions dominate. Overall, the impact of O<sub>3</sub> and its precursor transport from the



Fig. 7. Time-height cross section plot of (a) observed, (b) simulated O<sub>3</sub> (O<sub>3</sub>, ppbv), (c) observed vertical wind velocity at Westport, (d) ceilometer-measured attenuated backscatter (km<sup>-1</sup>·sr<sup>-1</sup>) at Eatons Neck on Aug. 8, 2018.



**Fig. 8.** WRF-Chem's predictions (a,b) surface  $O_3$  and (c,d)  $O_3/NO_y$  at 10:00 EST and 14:00 EST on 08, Aug. 2018. The studying area is highlighted in red boxes. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)

NYC area to LIS needs to be considered when emission control strategies are implemented to mitigate O<sub>3</sub> pollution effectively.

In summary, the detected subsidence drived by the stronger lowlevel jet and the presence of clouds on Aug. 6 were responsible for the difference between these two representative  $O_3$  episodes. Moreover, the variation in OPS is another important factor accounting for the large differences observed.

## 3.4. Quantification of different processes in the two representative $O_3$ episodes

To better quantify the contribution from individual process to the  $O_3$  exceedance events at LIS, we calculate the hourly relative contributions from chemical and physical processes to the total  $O_3$  budget through an

IPR analysis. The IPR analysis results were obtained from the WRF-Chem simulations at the nearest point to the Eatons Neck.

As shown in Fig. 9, chemical processes were found to be important to  $O_3$  formation in both cases. The produced  $O_3$  through chemical reaction at Eatons Neck and studying time period was 4.6 ppbv·hr<sup>-1</sup> on Aug. 6 and 6.2 ppbv·hr<sup>-1</sup> on Aug. 8, respectively. However, due to the low-level clouds, the contribution of chemical reaction significantly reduced to 0.4 ppbv·hr<sup>-1</sup> on Aug. 9 at Eatons Neck.

Physical processes including horizontal advection and vertical transport posed positive contributions to  $O_3$  enhancement on 5, 6, and 8 Aug. The contributions of regional transport to surface  $O_3$  on Aug. 6 was much higher than that on Aug. 8 (3.8 ppbv·hr<sup>-1</sup> vs. 1.2 ppbv·hr<sup>-1</sup>). Our results further proved that regional transport and local chemical reaction are the key factors for the development of episodes observed on



Fig. 9. Contribution of physical and chemical process to O<sub>3</sub> changes at Eatons Neck calculated through IPR analysis.

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#### Aug. 6 and 8, respectively.

As introduced in Section 1, air pollutants from NYC were transported to the downwind areas, exerting an important impact on air quality over LIS. Thus, a sensitive study was conducted without anthropogenic emissions to quantify the relative contributions from the NYC area to the air quality over LIS.

In order to quantify the relative contribution of regional transport from the NYC area to LIS, a sensitive study was conducted without any anthropogenic emission reduction applied to NYC. The results indicated that the regional contribution of  $O_3$  from the NYC area (urban emissions) varied greatly for the two representative  $O_3$  enhancement episodes. During the daytime (07:00–18:00 EDT), the  $O_3$  contribution from the NYC area to Eatons Neck ranged from 8.1 to 27.4 ppbv per-hour on Aug. 6, accounting for 5.9–40.0% of the total  $O_3$  levels (Fig. 10). This indicated the significant impact of transport from NYC in elevating  $O_3$ ambient levels. On the other hand, the NYC area only contributed 0.6–12.6 ppbv per-hour on Aug. 8, which only explained 1.7–27.1% of  $O_3$  episode. Therefore, our results underscore the necessities in expanding the emission reduction area to offset the impact from the NYC area if the regional transport dominates.

It is worth noting that the factors influencing surface  $O_3$  budget are more complex for LIS, a coastal area, which is affected by local-scale circulation such as sea breezes and regional transport from other upwind areas. Hence, further sensitive studies are necessary to identify the contributions from other source regions to LIS and their impact on OPS variations.

#### 4. Conclusions and implications

Summertime  $O_3$  pollution poses a significant risk to millions of people living in NYC and surrounding areas. In the summer of 2012, the LISTOS field campaign was carried out with a synergistic combination of multi-source observations and model studies to better understand the underlying mechanisms responsible for  $O_3$  exceedance events over LIS.

This study aimed at to better understand the mechanisms driving summertime  $O_3$  pollution by utilizing the WRF-Chem model and a collection of 3D observational data from LISTOS 2018 campaign. High-resolution simulations were able to capture the spatiotemporal variations of  $O_3$ ,  $NO_x$ ,  $NO_y$ , meteorological variables, and vertical structures of air pollutants during episode development. The study identified two representative  $O_3$  enhancement events dominated by regional transport and local photochemical reactions, respectively.

When the regional transport was dominant, the study found that  $O_3$  laminar structure with concentration of 60  $\sim$  100 ppbv within the atmospheric boundary layer was transported down to the surface layer through subsidence movement. On the other hand, when local photochemical reactions were the dominant contributions to  $O_3$  enhancement, a pool of  $O_3$  with concentration higher than 80 ppbv was formed below the height of 1 km.

The study found a significant variations in OPS associated with regional transport. Higher  $NO_x$  emissions from power plants, transportation, and fossil fuel combustion activities over the NYC decreased the VOC-to- $NO_x$  ratio, shifting the OPS toward the VOC-limited regime. The study recommends adjusting the  $O_3$  control strategy for LIS dynamically based on varying OPS.

IPR analysis indicates that photochemical reactions positively contribute to the development of the two representative  $O_3$  exceedance events while the physical processes show great variations. On Aug. 6, physical processes including horizontal advection and vertical transport posted a maximum contribution of 3.8 ppbv·hr<sup>-1</sup> to  $O_3$  enhancement. Sensitivity studies with emission reduction scenario demonstrated that the  $O_3$  formation was highly related to regional source contributions from NYC with hourly  $O_3$  contribution reaching 27.4 ppbv on Aug. 6 and 12.6 ppbv on Aug. 8, accounting for 40% and 27.1% of the total production, respectively.

This study highlights the importance using a high resolution for simulating  $O_3$  episodes, especially the  $O_3$  vertical structure, over LIS and other coastal areas worldwide. Regional transport and local chemical reactions are identified as two key factors responsible for  $O_3$  enhancement from multi-source observations for LIS. The large contribution from the NYC area underscores the importance of strengthening the regional synergistic emission reduction strategy to mitigate ambient  $O_3$ pollution over LIS. The results also emphasize the need to adopt a dynamic  $O_3$  control strategy for LIS based on OPS, particularly in cases where local  $O_3$  levels are significantly influenced by non-local sources.

#### CRediT authorship contribution statement

Kaihui Zhao: Methodology, Investigation, Software, Validation, Formal analysis, Writing – original draft. Yonghua Wu: Supervision, Validation, Formal analysis, Writing – review & editing. Jianping Huang: Supervision, Conceptualization, Methodology, Writing – review & editing. Guillaume Gronoff: Methodology, Writing – review & editing. Timothy A. Berkoff: Software, Resources. Mark Arend: Resources.



Fig. 10. Daily variations of contribution (ppbv) from the sensitivity analysis from NYC (pink bar) and other areas (grey bar) to Eatons Neck on (a) Aug. 6 and (b) Aug. 8, as well as relative contribution on (c) Aug. 6 and (d) Aug. 8 (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article).

**Fred Moshary:** Conceptualization, Resources, Writing – review & editing.

#### **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.

#### Data availability

Data will be made available on request.

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#### Appendix A. Supplementary material

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