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1 **Figure The Characteristics and Sources of Roadside VOCs in Hong Kong:**

2 **Effect of the LPG Catalytic Converter Replacement Programme**

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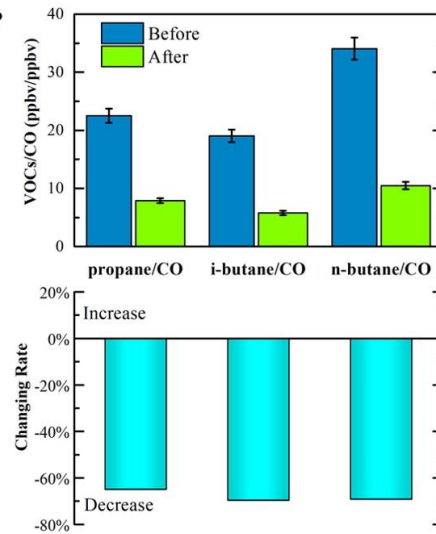
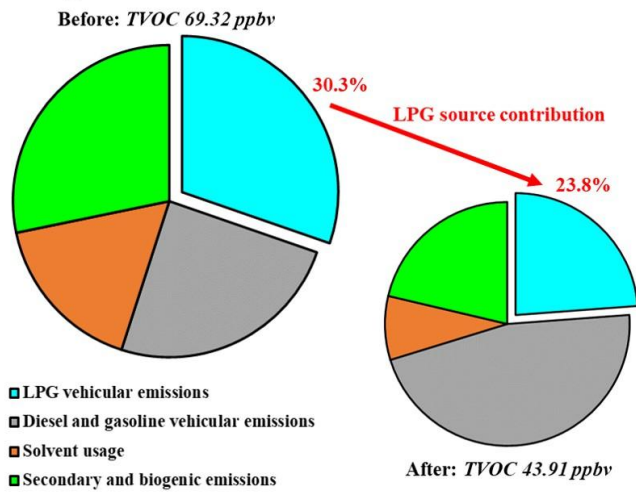
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## Graphical Abstract

### Large decrease of roadside VOCs after the LPG CCRP



## **Highlights**

- Roadside VOCs in Hong Kong showed a large decreasing trend after an LPG catalytic convertor replacement programme
- Emission ratios were applied to explore the contributions of primary and secondary/biogenic sources for roadside VOCs
- LPG vehicular emissions was the dominant source of roadside VOCs and its contribution has decreased after the air pollution control programme

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32 catalytic converter replacement programme
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### 37 **Abstract**

38 In order to improve local air quality of Hong Kong, more than 99% taxis and public  
39 light buses were changed from diesel to liquefied petroleum gas (LPG) fuel type in the  
40 early 2000s. In addition to the catalytic converters wear and tear, it is necessary to

41 control air pollutants emitted from LPG vehicles. Therefore, an LPG catalytic converter  
42 replacement programme (CCRP) was fulfilled from October 2013 to April 2014 by the  
43 Hong Kong government. Roadside volatile compounds (VOCs) were measured by  
44 on-line measurement techniques before and after the programme to evaluate the  
45 effectiveness of the LPG CCRP. The mixing ratios of total measured VOCs were found  
46 decreased from  $69.3 \pm 12.6$  ppbv to  $43.9 \pm 6.5$  ppbv after the LPG CCRP with the  
47 decreasing percentage of 36.7%. In addition, the total mixing ratio of LPG tracers,  
48 namely propane, i-butane, and n-butane, accounted for 49% of total measured VOCs  
49 before the LPG CCRP and the weighting percentage decreased to 34% after the  
50 programme. Moreover, the source apportionment of roadside VOCs also reflects the  
51 large decreasing trend of LPG vehicular emissions after the air pollution control  
52 measure. Due to the application of PTR-MS on measuring real-time VOCs and  
53 oxygenated volatile compounds (OVOCs) in this study, the emission ratios of  
54 individual OVOCs were investigated and being utilized to differentiate primary and  
55 secondary/biogenic sources of roadside OVOCs in Hong Kong. The findings  
56 demonstrate the effectiveness of the intervention programme, and are helpful to further  
57 implementation of air pollution control strategies in Hong Kong.

58 **Keywords:**

59 VOCs; PTR-MS; Emission Ratio; Secondary source; LPG emission.

60 **1 Introduction**

61 Hong Kong has been suffering from ozone ( $O_3$ ) pollution with an increasing  $O_3$  trend  
62 through the past decades like many other cities worldwide (Ding et al., 2013; Liu et

63 al., 2019; Wang et al., 2003; Zhang et al., 2007). Since O<sub>3</sub> pollution has both adverse  
64 effects on civil environment and human health (Bell et al., 2004; Lippmann, 1993;  
65 Sillman, 1999), it is necessary to mitigate O<sub>3</sub> pollution. Volatile organic compounds  
66 (VOCs) have been found to be the key factor leading to severe O<sub>3</sub> pollution in Hong  
67 Kong and the Pearl River Delta (PRD) region in China. Many previous studies have  
68 found that O<sub>3</sub> formation is VOCs-sensitive in urban areas of this region (Cheng et al.,  
69 2010; He et al., 2019; Ling and Guo, 2014; Wang et al., 2017a; Zhang et al., 2007).  
70 Therefore, in order to formulate and develop effective O<sub>3</sub> pollution controlling  
71 strategies, a better understanding on the characteristics and sources of VOCs in urban  
72 areas is required through different air pollution controlling stages.

73 VOCs are important precursors of O<sub>3</sub> and secondary organic aerosol (SOA), and have  
74 adverse health impact on human beings (Lelieveld et al., 2015; Sillman, 2002; von  
75 Schneidmesser et al., 2010). Ambient VOCs can be emitted from multiple sources,  
76 including anthropogenic and biogenic emissions (Kansal, 2009; Watson et al., 2001).  
77 Vehicular emissions are the major anthropogenic source in urban areas, especially for  
78 roadside environment in Hong Kong (Chan et al., 2002; Huang et al., 2015; Lee et al.,  
79 2002; Ling et al., 2011). It has been found that on-road vehicles contributed about 40%  
80 of ambient VOCs from 2002 to 2003 in Hong Kong. Later, vehicular emissions were  
81 found accounted up to 54% of ambient VOCs from 2006 to 2007 in Hong Kong (Lau  
82 et al., 2010). A multi-year study on source apportionment of ambient VOCs has been  
83 conducted from 2005 to 2013 in Hong Kong. It was found that gasoline evaporation  
84 and liquified petroleum gas (LPG) usage, together with vehicle exhaust accounted for

85 30~60% of ambient VOCs in urban areas of Hong Kong (Ou et al., 2015a). For  
86 roadside environment, vehicular emissions contributed the most (up to 89%) to  
87 ambient VOCs because of the high vehicle density in Hong Kong (Huang et al., 2015).  
88 Based on the statistics of Hong Kong Transport Department, there are more than  
89 794,366 licensed vehicles in an area of 1,104 km<sup>2</sup> by the end of 2019. Hong Kong  
90 government has undertaken a series of air pollution control measures to improve local  
91 air quality through the past decades (Lau et al., 2015). In order to mitigate vehicular  
92 emissions, a series of control strategies have been implemented in Hong Kong since  
93 early 2000s (Cui et al., 2018; Lyu et al., 2017). Therefore, total VOC emission factor  
94 has been decreased from 107 mg veh<sup>-1</sup> km<sup>-1</sup> in 2003 to 58 mg veh<sup>-1</sup> km<sup>-1</sup> in 2015.  
95 Moreover, nearly 99% taxis and public light buses have been switched from diesel to  
96 LPG fuel type from 2000 to 2003, and the most abundant VOCs species in ambient air  
97 changed from toluene to propane, i-butane and n-butane during this period (Cui et al.,  
98 2018). It was found that ozone formation potential (OFP) of LPG vehicular emissions  
99 comprised more than 51% of total measured VOCs at a roadside station in 2011  
100 (Huang et al., 2015). Hong Kong government has conducted an LPG catalytic  
101 converter replacement programme (CCRP) to replace the worn-out catalytic  
102 converters for taxis and public light buses since October 2013, and more than 80%  
103 LPG vehicles have fulfilled the replacement by the end of April 2014 (Lyu et al.,  
104 2016). Hence, it is necessary to evaluate the effectiveness of the LPG CCRP on VOCs  
105 reduction through investigating roadside VOCs.  
106 Oxygenated volatile organic compounds (OVOCs) are important portion of VOCs,

107 and they can be formed through primary anthropogenic emissions such as vehicular  
108 emissions, secondary source through photochemical production, and direct biogenic  
109 emissions (Karl et al., 2018; Mo et al., 2016; Ou et al., 2015b). Due to the lack of  
110 on-line measurement techniques for OVOCs before, it is hard to differentiate primary  
111 and secondary sources of ambient OVOCs in Hong Kong (Cui et al., 2016). Proton  
112 transfer reaction mass spectrometry (PTR-MS), a newly developed on-line  
113 measurement technique for OVOCs and VOCs, was firstly applied to measure  
114 roadside OVOCs and VOCs in this study. Therefore, primary and secondary sources  
115 of roadside OVOCs can be separated by using Linear regression fit (LRF) and  
116 positive matrix factorization (PMF) methods (Millet et al., 2005; Yuan et al., 2012).

117 In this study, roadside VOCs were continuously measured by on-line measurement  
118 techniques at a roadside air quality monitoring station in Hong Kong. The variations  
119 of roadside VOCs were investigated before and after the LPG CCRP. Emission ratios  
120 of OVOCs were calculated and utilized to differentiate primary and secondary sources  
121 for individual OVOCs species. Multiple sources of roadside VOCs and OVOCs were  
122 identified to evaluate the effectiveness of the LPG CCRP which has been launched in  
123 Hong Kong from October 2013 to April 2014.

## 124 **2 Methodology**

### 125 2.1 Sampling site

126 Mong Kok Air Quality Monitoring Station (MKAQMS), which is an urban roadside  
127 station set up by the Hong Kong Environmental Protection Department (HKEPD),



128 was selected as the field sampling site in this study (Chan et al., 2002; Cui et al., 2016;  
129 Yao et al., 2019). MKAQMS (22.32°N, 114.17°E) is located in a commercial and  
130 residential area with high vehicle density, because it is at the junction of two main  
131 roads, namely Lai Chi Kok Road, and Nathan Road in Mong Kok, Kowloon (Figure  
132 S1). Local anthropogenic emissions are the major sources of air pollutants at this site,  
133 and the influence of regional air masses is negligible (Cheung et al., 2014; Guo et al.,  
134 2011; Guo et al., 2013a). Real-time measurement of CO is continuously monitored by  
135 HKEPD, and non-dispersive infrared absorption method is used to measure CO  
136 concentration at MKAQMS (Ling et al., 2016; Louie et al., 2013; Ou et al., 2015a;  
137 Wang et al., 2017b). The instrument is regularly checked and calibrated according to  
138 the quality control and quality assurance (QA/QC) procedure established by HKEPD.

## 139 2.2 Measurement of VOCs

140 VOCs and OVOCs were continuously measured by PTR-MS (PTR-QMS 500,  
141 IONICON Analytik GmbH, Innsbruck, Austria) during 1<sup>st</sup> to 31<sup>st</sup> May 2013 and 1<sup>st</sup> to  
142 31<sup>st</sup> May 2014 at MKAQMS in this study. Detailed information of PTR-MS can be  
143 found elsewhere (de Gouw et al., 2003; de Gouw et al., 2006; Lindinger et al., 1998).  
144 H<sub>3</sub>O<sup>+</sup> was selected as the reagent ion for PTR-MS, the drift tube was operated at 2.2  
145 mbar pressure and the electric field was maintained at 600 V difference. In order to  
146 minimize wall loss, the inlet system and drift tube were maintained at 60 °C during  
147 the whole sampling period. The E/N (electric field strength / air density inside drift  
148 tube) value in the drift tube was kept at 136 Td. The residence time of sampling air  
149 passing through the inlet 1/8" Teflon tube was less than 2 s. Sampling inlet was 2 m

150 above the ground and the sampling flow rate was about 75 mL/min. Ionimed  
151 mix-VOC gas standard (IONICON Analytik GmbH, Innsbruck, Austria) was used for  
152 PTR-MS calibration in this study. One-point calibration was conducted every 24  
153 hours, and full calibration (gas standard was diluted by four different ratios) was  
154 performed every 6 days. Temperature and humidity influence on formaldehyde  
155 measurement was modified through multiple factor adjustment method raised by our  
156 group (Cui et al., 2016). The accuracy and the measurement precision of the PTR-MS  
157 was 3~20% and 1.6~10.0%, respectively.

158 An on-line GC-FID analyzer (Syntech Spectras GC 955, Series 600/800, the  
159 Netherlands) was used to continuously measure non-methane hydrocarbons (NMHCs)  
160 during whole sampling period. The analyzer was operated by HKEPD following strict  
161 QA/QC procedure as described in detail elsewhere (Cui et al., 2016; Xue et al., 2014).  
162 Two sampling systems and two columns were integrated together for the separation of  
163 C<sub>2</sub>-C<sub>5</sub> hydrocarbons and C<sub>6</sub>-C<sub>10</sub> hydrocarbons. In total, 27 VOCs species were  
164 monitored by the on-line GC-FID analyzer with the time resolution of 30 minutes.  
165 And hourly averaged VOCs mixing ratios were used for data analysis. The accuracy  
166 and precision of the measurements were 5~20% and 1.2~10.1%, respectively.

### 167 2.3 Positive matrix factorization (PMF) receptor model

168 USEPA PMF 5.0 model, a mathematical receptor model developed by U.S.  
169 Environmental Protection Agency (EPA), was utilized to perform source  
170 apportionment of roadside VOCs at MKAQMS in this study. Detailed information of

171 this model can be found elsewhere (Paatero, 1997; Paatero and Tapper, 1994). In brief,  
172 the concentration of individual VOC could be proportional to its emission amounts  
173 from different sources in the certain atmospheric volume (Song et al., 2007). Different  
174 source types could be identified by comparing with measured source profiles. Data set  
175 can be represented as a data matrix of factor contributions and factor profiles in the  
176 PMF results:

$$177 \quad x_{ij} = \sum_{k=1}^p g_{ik} f_{kj} + e_j \quad (1)$$

178 where  $x_{ij}$  is the  $j$  species concentration measured in the  $i$  sample,  $g_{ik}$  is the species  
179 contribution of the  $k$  source to the  $i$  sample,  $f_{kj}$  is the  $j$  species fraction from the  $k$   
180 source,  $e_j$  is the residual for each sample/species, and  $p$  is the total number of  
181 independent sources (Paatero, 2000). Hourly mixing ratios of VOCs and CO were  
182 used in the input file. The uncertainties for each sample/species were set as  $(DL^2 +$   
183  $Precision^2)^{1/2}$  and  $DL \times 5/6$  for the samples/species with their concentration higher and  
184 lower than the DL, respectively. In order to reduce the interference of high rates of  
185 missing data for some species, hourly mixing ratios of 26 VOCs species and CO  
186 during the sampling period were selected to conduct the source apportionment by  
187 PMF model in this study. The PMF model has been run by 20 times with a random  
188 seed, and base models encompassing 3 to 6 factors were derived. These models were  
189 then compared, so as to find the optimal solution. The optimum solution was finally  
190 determined based on both a good fit to the observed data and the most reasonable and  
191 interpretable results according to the knowledge on the sources of ambient VOCs in

192 Hong Kong. Good correlations were found between the observed and predicted VOC  
193 concentrations ( $r^2 = 0.83 \sim 0.95$ ) when four factors were derived, and the Q (robust)/Q  
194 (true) ratio was 0.85, which was less than 1.5 for the result to be accepted.

195

### 196 **3 Results and discussion**

#### 197 3.1 Mixing ratios and compositions of roadside VOC characteristics

198 Average CO concentration and mixing ratios of different VOC species before/after the  
199 LPG CCRP were listed in Table 1. Since the total vehicle loading at the sampling site  
200 was steady, the decreased of CO from  $1.07 \pm 0.23$  ppm before the LPG CCRP to  $0.65$   
201  $\pm 0.14$  ppm by 39.3% was due to the control of primary combustion source, namely  
202 vehicular emission in this study. On the other hand, the mixing ratio of total measured  
203 VOCs was  $69.3 \pm 12.6$  ppbv before the LPG CCRP, and decreased to  $43.9 \pm 6.5$  ppbv  
204 after the LPG CCRP with the decreasing percentage of 36.7%. Alkanes comprised the  
205 most of total measured VOCs both before (54.9%) and after (46.5%) the LPG CCRP.  
206 OVOCs was the second dominant group (22.7% before the LPG CCRP and 25.1%  
207 after the LPG CCRP), followed by alkenes (before: 12.2%; after: 12.8%), aromatics  
208 (before: 5.4%; after: 7.2%), alkyne (before: 4.2%; after: 8.0%) and others (before:  
209 0.6%; after: 0.6%). As the three most abundant VOC species, propane, i-butane, and  
210 n-butane, which are the tracers of LPG vehicular emissions (Chen et al., 2001; Liu et  
211 al., 2008), comprised 49.0% of total VOCs before the LPG CCRP. Moreover, previous  
212 study at the same sampling site found that the sum concentration of propane, i-butane

213 and n-butane comprised about 50% of total measured VOCs in 2011 (Huang et al.,  
214 2015). Due to the large decrease of propane (54.6%), i-butane (51.7%), and n-butane  
215 (59.4%) after the LPG CCRP, weighting percentage of alkanes to total VOCs  
216 decreased from 54.9% to 46.5%. For OVOCs, even though its weighting percentage  
217 to total VOCs changed from 22.7% to 25.1%, total OVOC mixing ratio decreased by  
218 30.0% after the LPG CCRP. Formaldehyde as the most abundant OVOC species, its  
219 mixing ratio decreased the most after the LPG CCRP by 55.5%. Other OVOC species  
220 also showed decreasing trend with the changing rate ranged from 11.1% to 28.3%.

221 The number of on-road vehicles at AMKAQMS has been recorded by camera and  
222 manually counted for 16 days totally in May and August 2013, February and August  
223 in 2014 by HKEPD. Traffic volume and the diurnal variation pattern of different fuel  
224 types for on-road vehicles at MKAQMS was given in Figure 1. It was found that LPG  
225 vehicle was the dominant vehicle type during the period of 1:00 a.m. ~ 4:00 a.m. LT.  
226 The average total VOCs mixing ratio decreased by 43.9% from  $82.4 \pm 16.2$  ppbv to  
227  $43.7 \pm 6.7$  ppbv after the LPG CCRP (as shown in Table S1). The decreasing  
228 percentage of total VOCs during nighttime was higher than that during whole day,  
229 especially for LPG tracers and OVOCs, which could be resulted from negligible  
230 photochemistry reaction and accumulation of primary anthropogenic emissions during  
231 nighttime (Figure 2). Moreover, the decreasing percentage of propane, i-butane, and  
232 n-butane were 58.2%, 53.9%, and 62.2%, respectively during nighttime when total  
233 LPG vehicle loading was the highest during 1:00 a.m. ~ 4:00 a.m. LT. Based on a  
234 repeated tunnel study in Hong Kong, it was found that the LPG vehicle emission

235 factors of propane, i-butane, and n-butane decreased by 77.8%, 57.8%, and 60.5%,  
236 respectively (Cui et al., 2018). The large reduction of propane, i-butane, and n-butane  
237 emission factors from LPG vehicle was consistent with their decreasing trends in  
238 roadside environment from this study.

### 239 3. 2 Diurnal variation of individual VOCs

240 Diurnal variations of several individual VOCs and CO were illustrated in Figure 3.  
241 Apart from morning traffic peak and afternoon traffic peak, CO concentrations  
242 showed a midnight peak around 1:00 a.m. to 2:00 a.m., due to the lower boundary  
243 layer and high LPG vehicle loading at midnight. and the sum weight percentage of  
244 LPG tracers comprised more than 50% of total VOCs. Therefore, midnight peaks for  
245 propane, i-butane, and n-butane can be found from 1:00 a.m. to 3:00 a.m.. Because of  
246 the effectiveness of LPG vehicular emission control measure, midnight peaks of  
247 propane, i-butane, and n-butane decreased from 18.3 ppbv, 14.9 ppbv, 28.2 ppbv,  
248 respectively, to 7.5 ppbv, 6.8 ppbv, 10.6 ppbv, respectively, after the LPG CCRP.  
249 Otherwise, diurnal cycle of benzene only showed two traffic peaks in the morning and  
250 afternoon without the midnight peak since diesel and gasoline vehicular emissions  
251 were its major sources (Ho et al., 2009; Liu et al., 2008). Mixing ratios of  
252 formaldehyde and acetaldehyde increased to their maximum level around 10 a.m. and  
253 then showed decreasing trends through the day, their diurnal variation patterns  
254 reflected the importance of secondary formation for these reactive OVOC species  
255 (Corrêa et al., 2003; Taatjes et al., 2012). Diurnal cycle of isoprene mixing ratio  
256 followed the solar radiation cycle as expected since biogenic emission is its major

257 source (Mayrhofer et al., 2005; Rinne et al., 2002). Meanwhile, MVK and MACR,  
258 which are the photooxidation products of isoprene had a single afternoon peak due to  
259 photochemical reactions from isoprene (Biesenthal and Shepson, 1997; Cheung et al.,  
260 2014; Ling et al., 2019).

### 261 3.3 Photochemical reactivity of VOCs

262 Photochemical reactivity of VOCs can be analyzed by both maximum incremental  
263 reactivity (MIR) method and propene-equivalent (Prop-Equiv) concentration (Carter,  
264 1995; Chameides et al., 1992; So and Wang, 2004; Venecek et al., 2018). Detailed  
265 information of the above two methods were given in supplementary material. As  
266 shown in Figure 4, total ozone formation potential (OFP) of VOCs decreased from  
267 209.4 ppbv O<sub>3</sub>/ppbv to 132.7 ppbv O<sub>3</sub>/ppbv by 36.6%, and total Prop-Equiv  
268 concentration of VOCs decreased from 70.3 ppbC to 48.3 ppbC by 31.2%. Alkenes  
269 comprised the most of total OFP both before (34.4%) and after (36.3%) the LPG  
270 CRRP, followed by OVOCs (before: 28.8%; after: 28.8%), alkanes (before: 20.8%;  
271 after: 15.4%), aromatics (before: 15.6%; after: 18.6%), and alkyne (before: 0.4%;  
272 after: 0.7%) as shown in Figure 4b. For Prop-Equiv concentration, alkenes contributed  
273 the most among different VOC groups (before: 58.2%; after: 62.1%), followed by  
274 alkanes (before: 16.2%; after: 11.2%), OVOCs (before: 13.5%; after: 13.9%),  
275 aromatics (before: 11.8%; after: 12.3%), and alkyne (before: 0.3%; after: 0.5%) as  
276 shown in Figure 4d. OFP and the weight percentage of individual VOCs before and  
277 after the LPG CCRP were given in Table S2. TOP 10 species contributed more than  
278 80% of total OFP both before and after the LPG CCRP. Formaldehyde contributed the

279 most (12.7%) of total OFP for OVOCs before the LPG CCRP and decreased to only  
280 8.9% after the LPG CCRP. OFP of n-butane decreased from 21.5 ppbv O<sub>3</sub>/ppbv to 8.7  
281 ppbv O<sub>3</sub>/ppbv with its ranking changed from TOP 3 to TOP 9. Similarly, Prop-Equiv  
282 concentration of TOP 10 species also contributed more than 80% both before and  
283 after the LPG CCRP (as given in Table S3). Moreover, Prop-Equiv concentration of  
284 n-butane decreased by 59.4% with its ranking changed from TOP 4 to TOP 8 after the  
285 LPG CCRP.

### 286 3.4 Primary and secondary/biogenic sources of individual VOCs

287 Linear regression fit (LRF) method was utilized in this study to determine emission  
288 ratios of individual VOCs. Since nighttime chemistry process is negligible for most  
289 VOCs, the VOCs data obtained during 1:00 a.m. to 4 a.m. can be used for the LRF  
290 method (Brito et al., 2015). As one of products from incomplete combustion source,  
291 CO was usually used as the long-lived anthropogenic marker (de Gouw et al., 2008).  
292 Thus, the slope of individual VOCs to CO during nighttime can be selected as their  
293 emission ratios (von Schneidmesser et al., 2010; Warneke et al., 2007). The temporal  
294 filter used in this study was suitable as shown in Figure 5 and Figure S2. Furthermore,  
295 primary and secondary/biogenic source of individual VOCs could be determined by  
296 their emission ratios through following equations (Millet et al., 2005).

$$297 \tau_a = \tau_{\text{pri}} + \tau_{\text{sec/bio}} + \tau_b \quad (\text{a})$$

$$298 \tau_{\text{pri}} = \text{ER} \times \tau_{\text{co}} \quad (\text{b})$$

299 Where  $\tau_a$  is the mixing ratio of specie  $i$  in ambient air,  $\tau_{\text{pri}}$  is the mixing ratio of specie



300  $i$  from primary source,  $\tau_{\text{sec/bio}}$  is the mixing ratio of specie  $i$  from secondary/biogenic  
301 source,  $\tau_b$  the background mixing ratio of specie  $i$  is defined as the 0.1 quantile of  
302 measured mixing ratio (Goldan et al., 1995), ER stands for the emission ratio of  
303 specie  $i$ , and  $\tau_{\text{co}}$  is the mixing ratio of ambient CO.

304 Emission ratio of formaldehyde was 4.92 ppbv/ppmv before the LPG CCRP, and  
305 decreased to 1.41 ppbv/ppmv after the LPG CCRP. A previous study conducted in  
306 Huston at the Moody Tower site found the average emission ratio of formaldehyde to  
307 CO was about 3.0 ppbv/ppmv through early morning traffic peak periods (Parrish et  
308 al., 2012), which is in the same range as in this study. For other OVOC species, their  
309 emission ratios shown decreasing trend after the LPG CCRP, which could reflect the  
310 effectiveness of air pollution control measure. However, the emission ratio of acetone  
311 increased from 2.83 ppbv/ppmv to 3.21 ppbv/ppmv, since the emissions from  
312 anthropogenic emissions such as solvent usage could affect the results (Guo et al.,  
313 2013b), but its range was consistent with the emission ratio in London (3.18  
314 ppbv/ppmv) (Valach et al., 2014). The emission ratio of isoprene was steady around  
315 0.74 ~ 0.77 ppbv/ppmv, which is slightly lower than that found in São Paulo (1.17  
316 ppbv/ppmv) and London (1.13 ppbv/ppmv) (Brito et al., 2015; Valach et al., 2014),  
317 but higher than that reported in Los Angeles (0.30 ppbv/ppmv) and Mexico City (0.08  
318 ppbv/ppmv) (Bon et al., 2011; Borbon et al., 2013).

319 The ratios of propane, i-butane, n-butane to CO were used in this study to evaluated  
320 the changing source contributions from LPG vehicular emissions (as shown in Figure  
321 6). The average emission ratio of propane decreased from 22.5 to 7.9 after LPG CCRP

322 with the decreasing percentage by 65.0%. And the emission ratios of i-butane and  
323 n-butane decreased by 69.4% and 69.2%, respectively. Moreover, the changing rate of  
324 the emission ratios of LPG tracers, namely propane, i-butane, and n-butane were  
325 consistent with their changing rate of LPG vehicular emission factors through  
326 previous tunnel study in Hong Kong (Cui et al., 2018). Therefore, the large decrease  
327 of emission ratios of propane, i-butane, and n-butane in this study could reflect the  
328 effective reduction of on-road LPG emissions after the LPG CCRP in Hong Kong.

329 The diurnal cycles of individual OVOCs and biogenic VOCs (BVOCs) from primary  
330 and secondary/biogenic emissions before and after the LPG CCRP were plotted in  
331 Figure 7 and Figure S3. In general, the portion of methanol, acetone, and  
332 monoterpenes from primary source contributed more than 60% and 70%, respectively,  
333 before and after the LPG CCRP. For formaldehyde, acetaldehyde, isoprene, and  
334 MVK+MACR, secondary/biogenic component were more significant than other  
335 species, which could reflect the importance of secondary/biogenic emissions for these  
336 species. Moreover, secondary/biogenic peaks of most selected OVOCs and BVOCs  
337 occurred in the afternoon due to photochemistry reaction process, and early morning  
338 peaks for their primary component (Yuan et al., 2012).

### 339 3.5 Source apportionments of roadside VOCs

340 Four sources, namely diesel and gasoline vehicular emissions, LPG vehicular  
341 emissions, solvent usage, and secondary and biogenic emissions, were identified for  
342 roadside VOCs by using PMF method before and after the LPG CCRP (as shown in

343 Figure 8). Factor 1 was considered to be diesel and gasoline vehicular emissions  
344 because it was dominated by C<sub>2</sub>-C<sub>5</sub> alkanes/alkene , large amount of CO, benzene,  
345 and toluene, which are typical markers from diesel-related and gasoline-related source  
346 (Liu et al., 2008; Schmitz et al., 2000). Since propane, i-butane, and n-butane these  
347 three LPG tracers contributed the most in Factor 2, it was identified as LPG vehicular  
348 emissions (Chen et al., 2001). Factor 3 contributed the largest portion to ethylbenzene,  
349 m, p-xylene, and o-xylene, thus, it was regarded as solvent usage (Ou et al., 2015a;  
350 Seila et al., 2001). Isoprene and OVOCs were dominant species in Factor 4, since  
351 biogenic emission is the major source of isoprene (Rinne et al., 2002), and most  
352 OVOCs were mainly formed through secondary formation (Li et al., 2015; Taatjes et  
353 al., 2012; Yuan et al., 2012), this factor could be considered as secondary and biogenic  
354 emissions.

355 LPG vehicular emissions was the dominant source for total VOCs mixing ratio both  
356 before and after the LPG CCRP (Figure 9). However total VOCs emitted from LPG  
357 vehicular emissions decreased from 30.5 ppbv to 13.8 ppbv by about 55% after the  
358 LPG CCRP. Meanwhile, the contribution of LPG vehicular emissions to total VOCs  
359 decreased from 45% to 38% (Figure S4). The contributions of diesel and gasoline  
360 vehicular emissions, solvent usage, secondary and biogenic emissions increased to  
361 35%, 11%, and 17%, respectively, due to the large decreasing portion of LPG  
362 vehicular emissions. However, the absolute mixing ratios of VOCs from diesel and  
363 gasoline vehicular emissions, solvent usage, secondary and biogenic emissions all  
364 decreased with the changing percentage of 22%, 59%, and 50%, respectively.

365 Vehicle-related source, in sum, contributed 69% and 46%, respectively, before and  
366 after the LPG CCRP. Secondary and biogenic emissions cannot be negligible in  
367 roadside environment since they contributed around 17% of total VOCs both before  
368 and after the LPG CCRP.

369 Secondary/biogenic source contributions to individual OVOCs and BVOCs by LRF  
370 and PMF method before and after the LPG CCRP were compared in Figure 10. It  
371 could be found that these two different methods agree well with each other with the  
372 difference less than 20%. The ratio of m,p-xylenes to ethylbenzene, which was  
373 commonly used to indicate the photochemical age (de Gouw et al., 2005), was  $1.35 \pm$   
374  $0.02$  and  $1.75 \pm 0.03$ , respectively, before and after the LPG CCRP in this study, and  
375 these ratios were in the normal range from 1.3 to 1.8 in urban areas of Hong Kong  
376 (Guo et al., 2007; Ho et al., 2004). Therefore, the contributions of secondary/biogenic  
377 source for most OVOCs decreased after the LPG CCRP through both LRF and PMF  
378 method resulted from less secondary formation could demonstrate the reduction of  
379 VOCs from primary sources.

### 380 3.6 OFP of roadside VOCs from different sources

381 Because of the large decrease of VOC mixing ratios, total OFP of VOCs decreased  
382 from 193.3 ppbv O<sub>3</sub>/ppbv to 108.5 ppbv O<sub>3</sub>/ppbv after the LPG CCRP. Based on the  
383 VOC mixing ratios obtained from source apportionment, OFP of roadside VOCs from  
384 different sources could be calculated, and their contributions were illustrated in Figure  
385 11. LPG vehicular emissions were found to be the dominant source of total OFP

386 accounting for 30% before the LPG CCRP. While this percentage decreased to 24%  
387 after the LPG CCRP. Diesel and gasoline vehicular emissions, however, changed to be  
388 the dominant source of total OFP accounting for 14% after the LPG CCRP, but its  
389 absolute OFP decreased from 58.0 ppbv O<sub>3</sub>/ppbv to 50.4 ppbv O<sub>3</sub>/ppbv. Moreover, the  
390 contributions of solvent usage and secondary/biogenic emissions both decreased by  
391 30~50%. Therefore, the implementation of on-road LPG vehicular emission control  
392 measure improved the reduction of local ozone formation potential of roadside VOCs.

#### 393 **4 Conclusions**

394 A programme to replace worn-out catalytic converters for nearly all LPG-fueled taxis  
395 and public light bus has been implemented between October 2013 and April 2014  
396 to reduce vehicular emissions in Hong Kong. In this study, PTR-MS was firstly  
397 introduced to continuously monitor roadside VOCs and OVOCs in Hong Kong,  
398 coupling with on-line GC-FID measurement technique, the effectiveness of this  
399 programme was evaluated through investigating roadside VOCs before and after the  
400 LPG CCRP. The decreasing percentage of the mixing ratio of total measured VOCs  
401 was 40.6% after the implementation of the LPG CCR, and the total weighting  
402 percentage of LPG tracers decreased from 49% to 34%. Emission ratios of individual  
403 VOCs were estimated through LRF method, the reduction of emission ratios of  
404 individual VOCs, especially for propane, i-butane, and n-butane, reflect the  
405 effectiveness of this air pollution control programme on improving roadside air  
406 quality of Hong Kong. LPG vehicular emissions was the dominant source which  
407 comprised about 44.7% of total VOCs at the roadside monitoring station, and its

408 weighting percentage reduced to only 37.8% with the absolute VOCs mixing ratio  
409 from LPG vehicular emissions decreased from 30.5 ppbv to 13.8 ppbv by about 55%  
410 after the LPG CCRP. The ozone formation potentials of each emission source were  
411 also investigated, and large decrease of total OFP and the portion of LPG vehicular  
412 emissions were also found in this study. In the sight of VOCs, the air pollution control  
413 measure conducted by the Hong Kong government could effectively reduce on-road  
414 vehicle emissions and improve roadside air quality.

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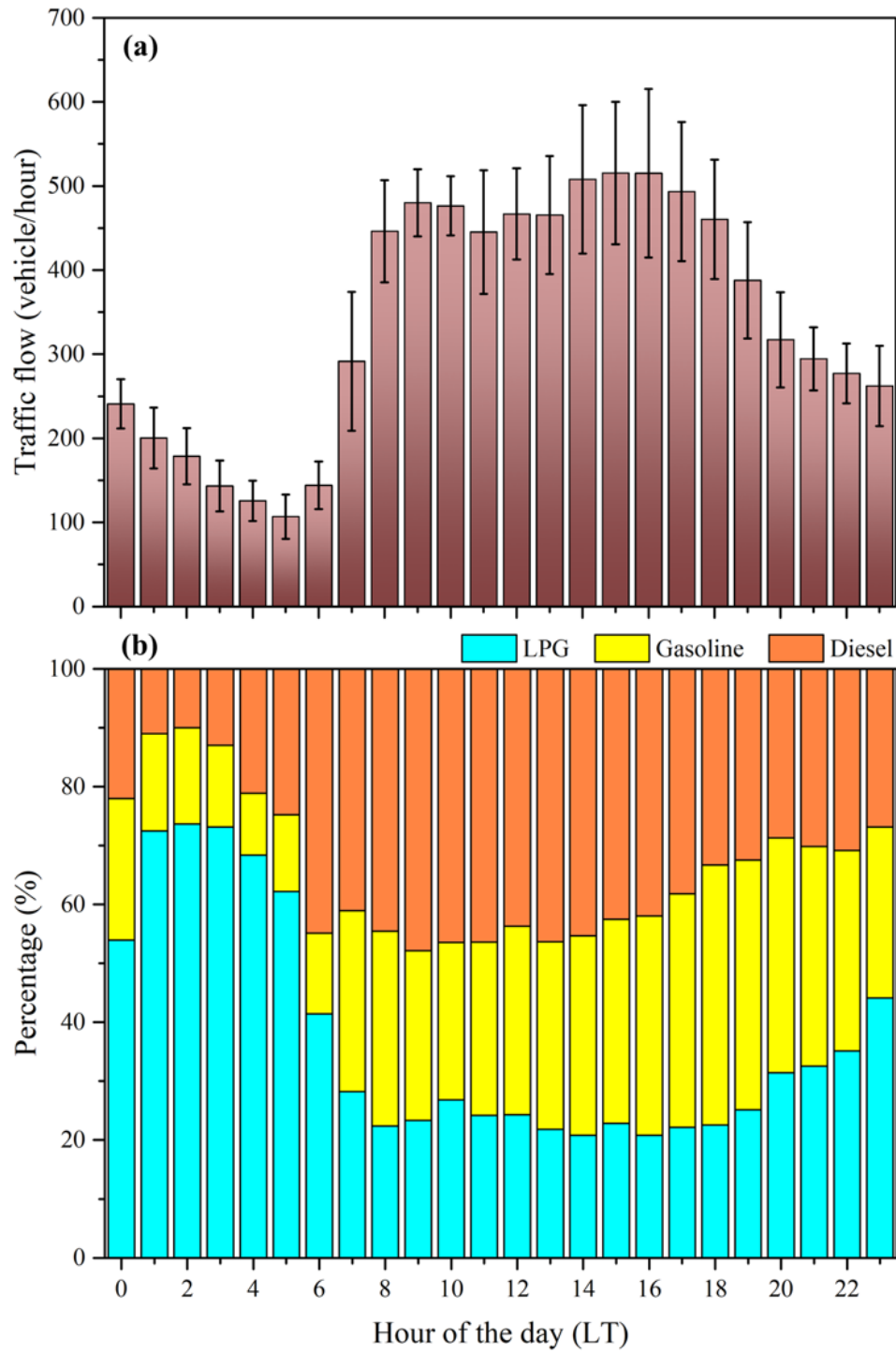
672

**Table 1.** The mixing ratios (in ppbv) of CO and VOCs measured at MKAQMS before and after the LPG CCRP

Group	Species	Before the LPG CCRP				After the LPG CCRP			
		Average	S.D.	Max	Min	Average	S.D.	Max	Min
	CO	978.47	169.55	1650.20	675.76	703.48	169.77	1554.52	336.79
<b>Alkanes</b>	Ethane <sup>a</sup>	1.90	0.49	3.89	1.02	4.00	1.29	9.03	0.55
	Propane <sup>a</sup>	10.23	5.84	40.03	2.89	4.64	2.28	17.38	1.02
	<i>i</i> -Butane <sup>a</sup>	8.32	5.07	35.02	2.09	4.02	1.99	18.23	1.10
	<i>n</i> -Butane <sup>a</sup>	15.44	8.97	63.01	4.23	6.27	3.29	27.28	1.44
	<i>i</i> -Pentane <sup>a</sup>	1.10	0.68	4.83	0.00	0.78	0.56	8.28	0.11
	<i>n</i> -Pentane <sup>a</sup>	0.52	0.32	2.06	0.00	0.32	0.30	5.74	0.00
	<i>i</i> -hexane <sup>a</sup>	0.10	0.22	1.74	0.00	0.15	0.26	1.56	0.00
	<i>n</i> -Hexane <sup>a</sup>	0.24	0.30	3.40	0.00	0.07	0.22	2.26	0.00
	<i>i</i> -Octane <sup>a</sup>	0.11	0.10	0.81	0.00	0.11	0.11	0.79	0.00
	<i>n</i> -Heptane <sup>a</sup>	0.10	0.14	1.18	0.00	0.02	0.09	0.90	0.00
	<i>n</i> -Octane <sup>a</sup>	0.01	0.04	0.31	0.00	0.00	0.02	0.25	0.00
	<i>Sub-Total</i>	38.08	11.89			20.40	4.71		
<b>Alkenes</b>	Ethene <sup>a</sup>	4.35	1.15	8.76	2.07	3.17	1.58	7.31	0.00
	Propene <sup>a</sup>	2.01	0.73	4.50	0.65	0.97	0.37	2.64	0.28
	<i>trans</i> -2-Butene <sup>a</sup>	0.01	0.04	0.27	0.00	0.32	0.15	1.21	0.00
	1-Butene <sup>a</sup>	0.38	0.17	1.19	0.00	0.01	0.03	0.16	0.00
	<i>cis</i> -2-Butene <sup>a</sup>	0.10	0.07	0.40	0.00	0.04	0.05	0.43	0.00
	1,3-Butadiene <sup>a</sup>	0.13	0.06	0.36	0.00	0.07	0.05	0.39	0.00
	<i>trans</i> -2-Pentene <sup>a</sup>	0.08	0.09	0.66	0.00	0.03	0.07	0.84	0.00
	1-Pentene <sup>a</sup>	0.17	0.17	1.29	0.00	0.03	0.08	1.29	0.00
	Isoprene <sup>b</sup>	0.88	0.35	2.08	0.27	0.63	0.25	1.61	0.19
	Monoterpenes <sup>b</sup>	0.39	0.15	0.97	0.14	0.34	0.15	1.58	0.11

	<i>Sub-Total</i>	<i>8.49</i>	<i>1.44</i>			<i>5.61</i>	<i>1.66</i>		
<b>Alkyne</b>	Ethyne <sup>a</sup>	2.89	2.01	21.70	0.00	3.49	3.28	26.11	0.00
<b>Aromatics</b>	Benzene <sup>b</sup>	0.33	0.18	1.15	0.03	0.28	0.16	0.91	0.04
	Toluene <sup>b</sup>	1.64	0.91	5.78	0.21	1.73	1.05	6.19	0.24
	C <sub>2</sub> -Benzenes <sup>b</sup>	1.19	0.69	4.45	0.17	0.65	0.40	3.73	0.12
	1,3,5-Trimethylbenzene <sup>a</sup>	0.00	0.01	0.07	0.00	0.00	0.02	0.22	0.00
	1,2,4-Trimethylbenzene <sup>a</sup>	0.08	0.07	0.40	0.00	0.05	0.08	0.51	0.00
	1,2,3-Trimethylbenzene <sup>a</sup>	0.00	0.01	0.11	0.00	0.00	0.01	0.26	0.00
	Chlorobenzene <sup>b</sup>	0.12	0.08	0.38	0.00	0.14	0.06	0.36	0.05
	Dichlorobenzene <sup>b</sup>	0.29	0.11	0.74	0.10	0.21	0.10	0.88	0.02
	Trichlorobenzene <sup>b</sup>	0.07	0.09	0.94	0.02	0.09	0.03	0.34	0.00
	<i>Sub-Total</i>	<i>3.72</i>	<i>1.17</i>			<i>3.15</i>	<i>1.15</i>		
<b>OVOCs</b>	Formaldehyde <sup>b</sup>	4.49	2.29	12.62	0.17	2.00	1.21	8.13	0.24
	Methanol <sup>b</sup>	4.38	1.54	10.48	1.30	3.31	1.47	22.35	1.29
	Acetaldehyde <sup>b</sup>	1.99	1.03	5.92	0.00	1.74	0.82	5.70	0.42
	Acrolein <sup>b</sup>	1.67	0.74	4.29	0.08	1.20	0.52	3.54	0.38
	Acetone <sup>b</sup>	2.45	0.94	5.79	0.92	2.18	0.89	6.88	0.90
	MVK&MACR <sup>b</sup>	0.29	0.14	0.77	0.05	0.21	0.10	0.57	0.05
	MEK <sup>b</sup>	0.46	0.25	1.33	0.08	0.37	0.19	1.27	0.11
	<i>Sub-Total</i>	<i>15.73</i>	<i>3.19</i>			<i>11.00</i>	<i>2.32</i>		
<b>Other</b>	Acetonitrile <sup>b</sup>	0.42	0.09	0.75	0.21	0.25	0.06	0.63	0.10
	<b>Total</b>	<b>69.32</b>	<b>12.61</b>			<b>43.91</b>	<b>6.51</b>		

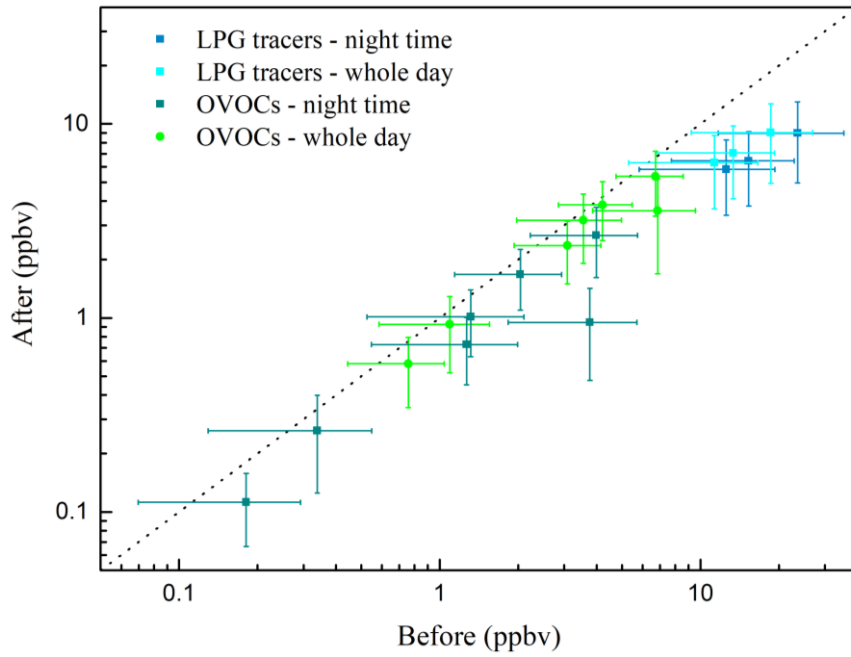
<sup>a</sup> Measured by on-line GC-FID.    <sup>b</sup> Measured by PTR-MS.



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2 **Figure 1.** (a) Traffic flow and (b) weighting percentage of different vehicle types at  
3 MKAQMS in Hong Kong

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5

6 **Figure 2.** Mixing ratios of LPG tracers and individual OVOCs at MKAQMS before  
7 and after the LPG CCRP. Nighttime is during 1:00 a.m. ~ 4:00 a.m.. Dashed line is the  
8 1:1 line for reference.

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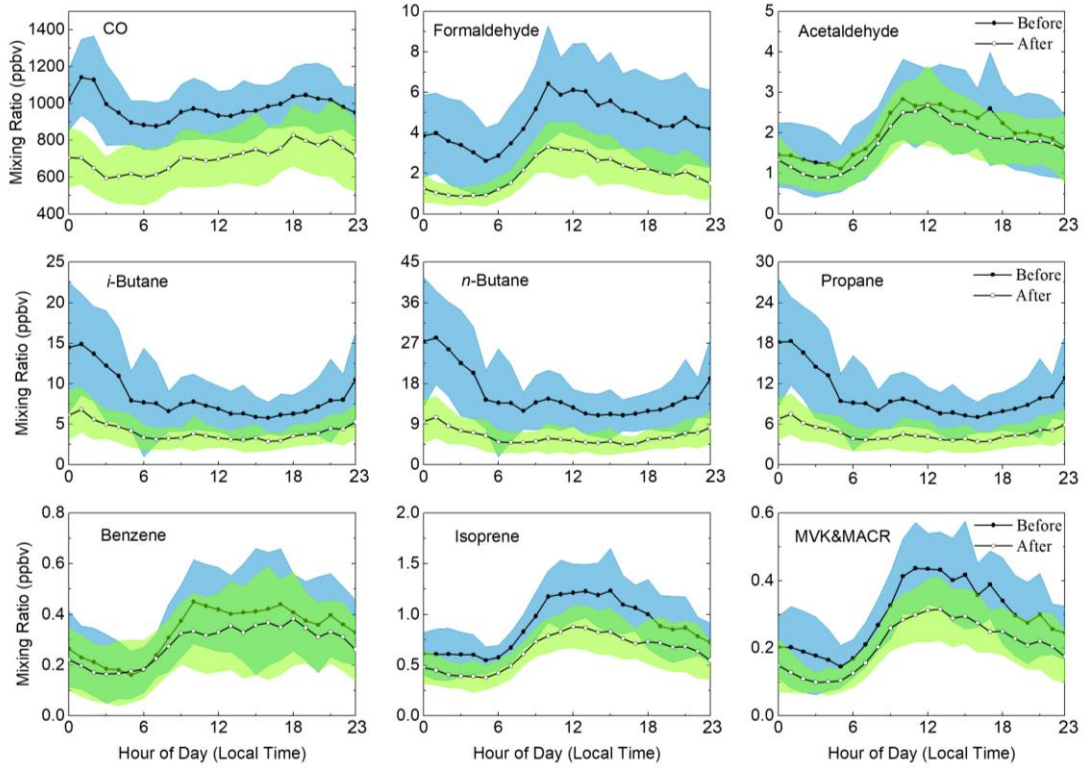
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17 **Figure 3.** Diurnal variation of individual VOC species at MKAQMS before and after  
 18 the LPG CCRP.

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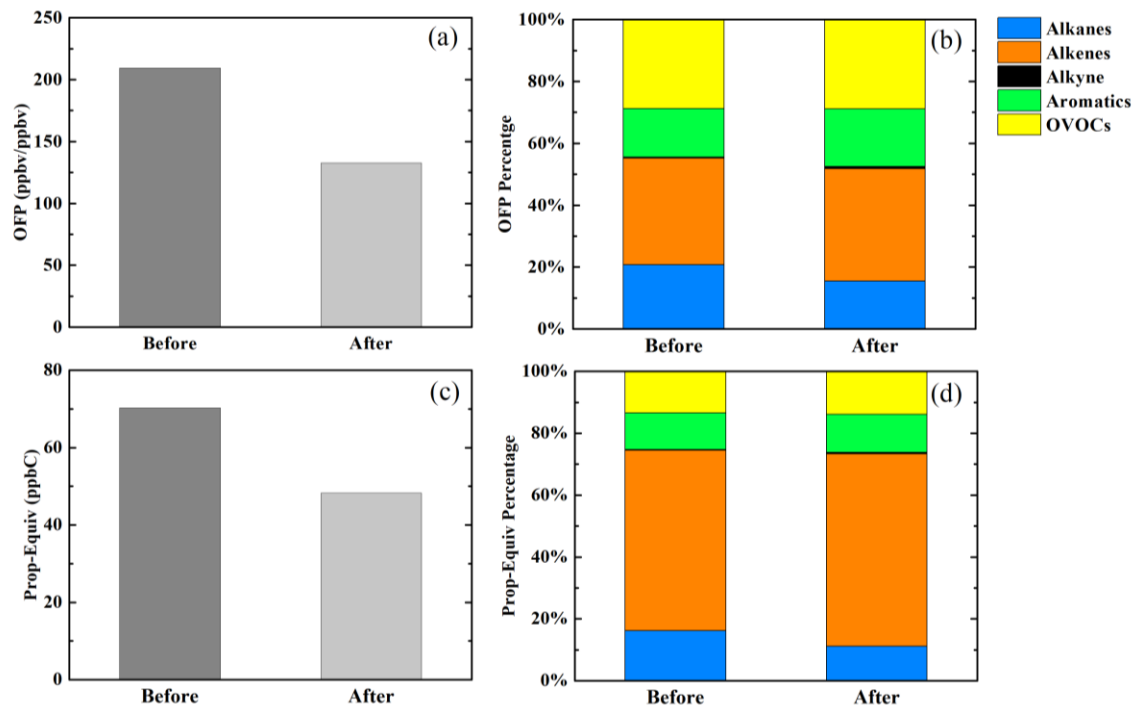
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26 **Figure 4.** Ozone formation potential (OFP) and propene-equivalent (Prop-Equiv)  
 27 concentration of roadside VOCs at MKAQMS before and after the LPG CCRP.

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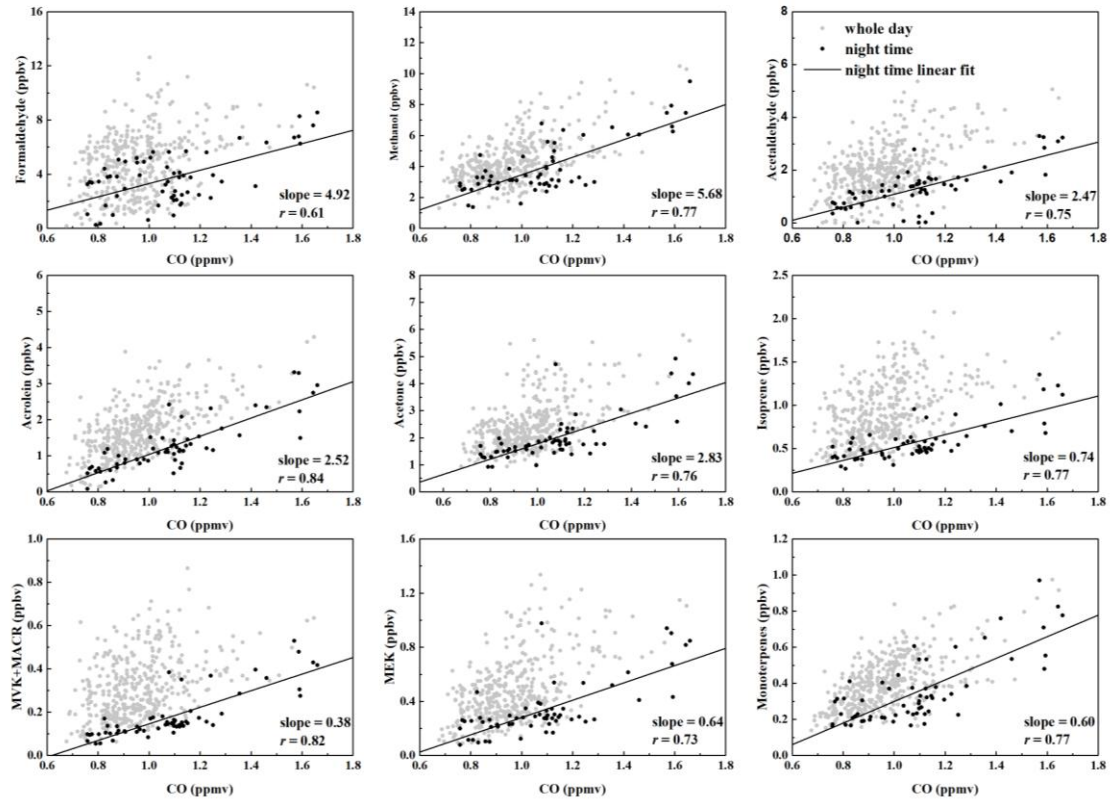
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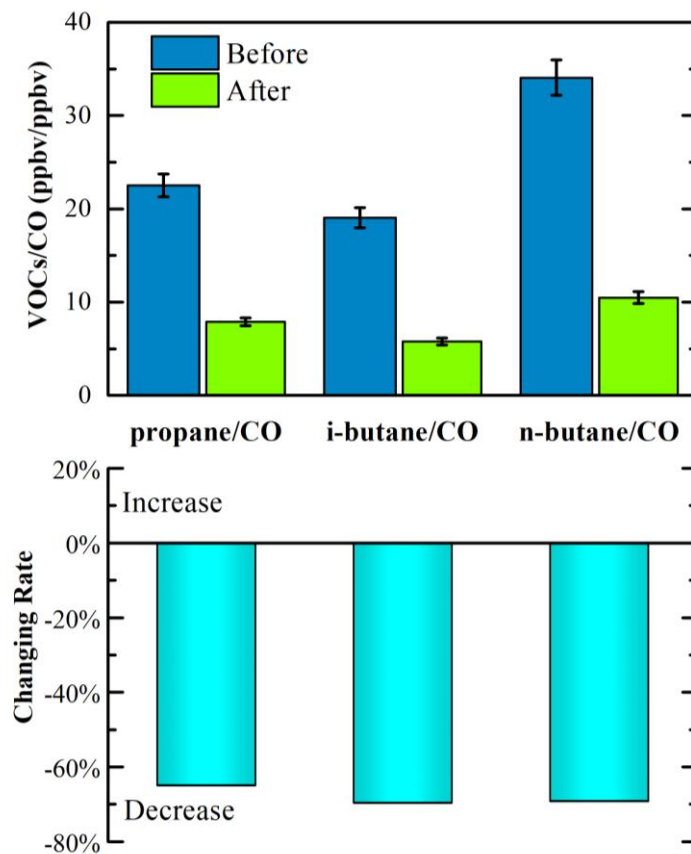
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34 **Figure 5.** Scatterplots of individual VOCs during nighttime (black dots) and whole  
 35 day (grey dots) at MKAQMS before the LPG CCRP.

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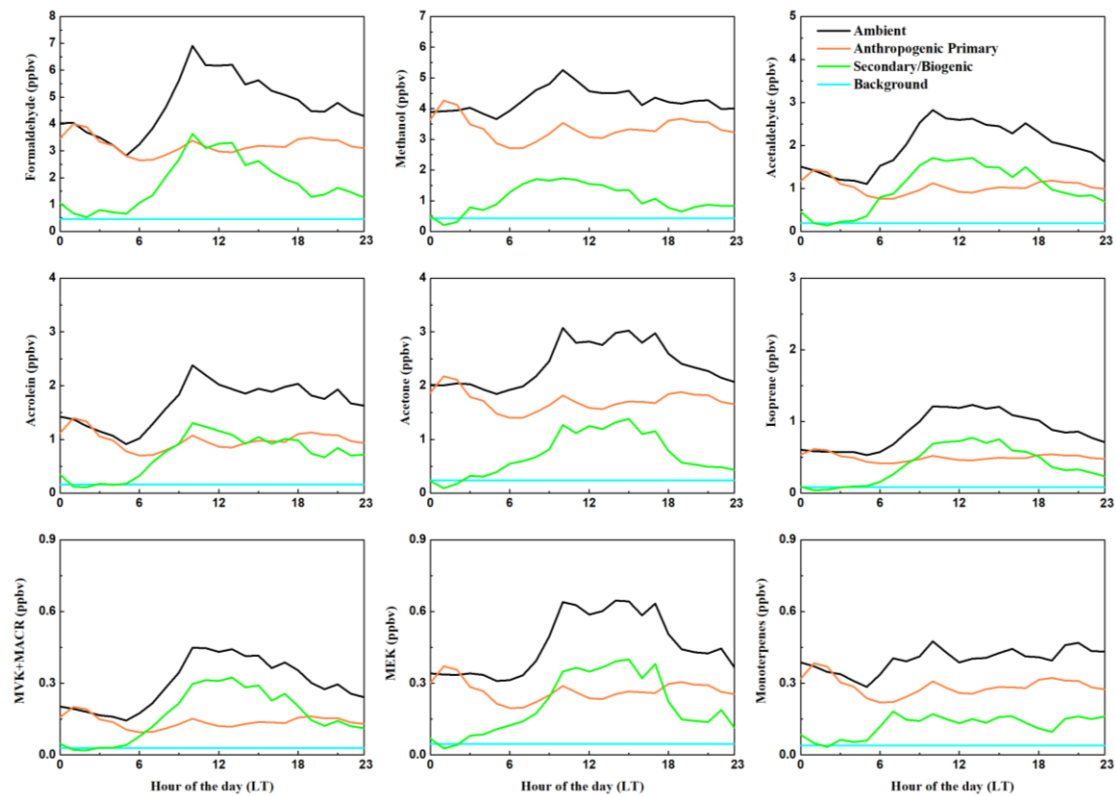
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40 **Figure 6.** The ratios of LPG tracers (propane, i-butane, and n-butane) to CO and their  
 41 changing rates at MKAQMS before and after the LPG CCRP.

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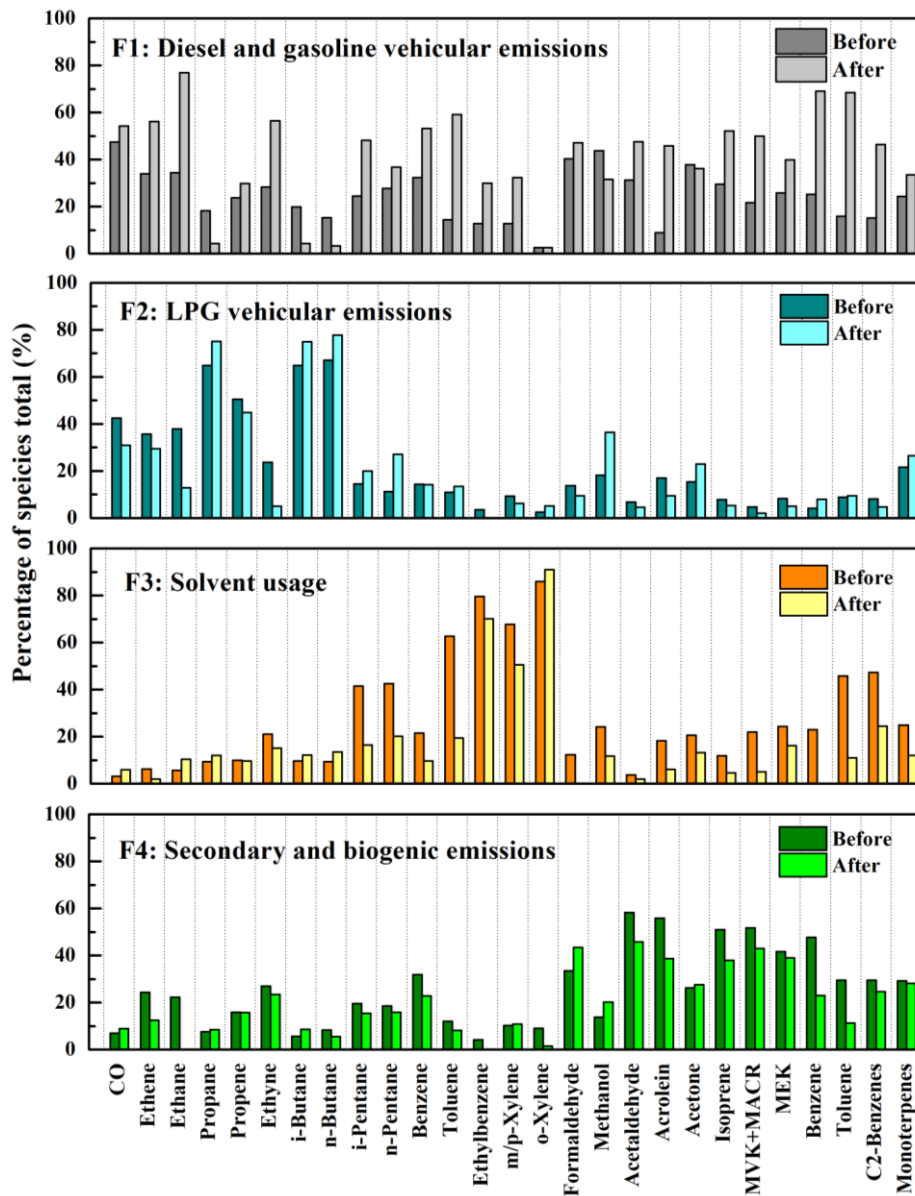
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46 **Figure 7.** Diurnal mixing ratio of individual VOCs before the LPG CCRP. Black line  
 47 is the ambient mixing ratio, orange line is the mixing ratio from anthropogenic source,  
 48 green line is the mixing ratio from secondary/biogenic source, blue line is the  
 49 background mixing ratio.

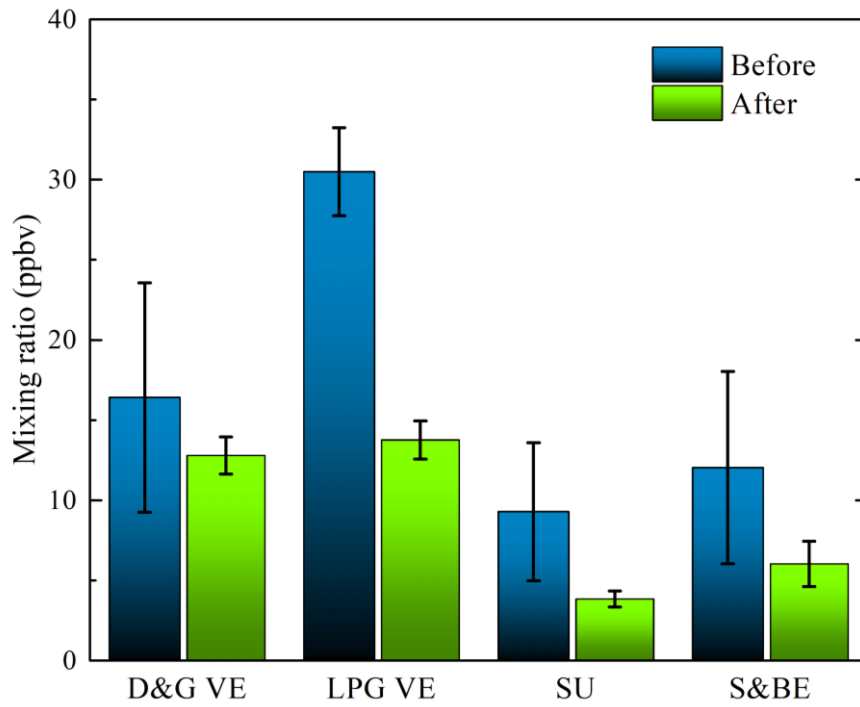
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52 **Figure 8.** Factor profiles (% of species) for roadside VOCs at MKAQMS before and  
 53 after the LPG CCRP.

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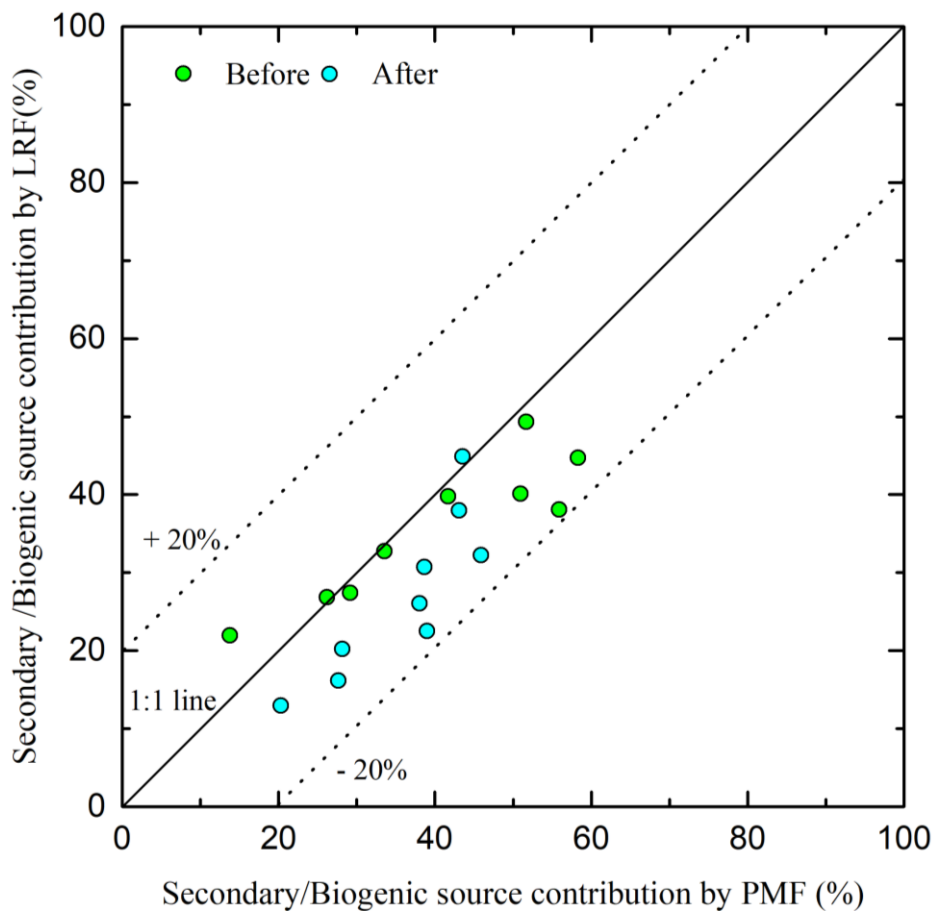


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56 **Figure 9.** Mixing ratios of roadside VOCs from different sources at MKAQMS before  
 57 and after the LPG CCRP. D&G VE: diesel and gasoline vehicular emissions; LPG VE:  
 58 LPG vehicular emissions; SU: solvent usage; S&BE: secondary and biogenic  
 59 emissions.

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62

63 **Figure 10.** Secondary/biogenic source contributions to individual OVOCs and  
 64 BVOCs by LRF and PMF method before (green dots) and after (blue dots) the LPG  
 65 CCRP. For reference, solid line and dashed lines are the 1:1 and  $\pm 20\%$  lines,  
 66 respectively.

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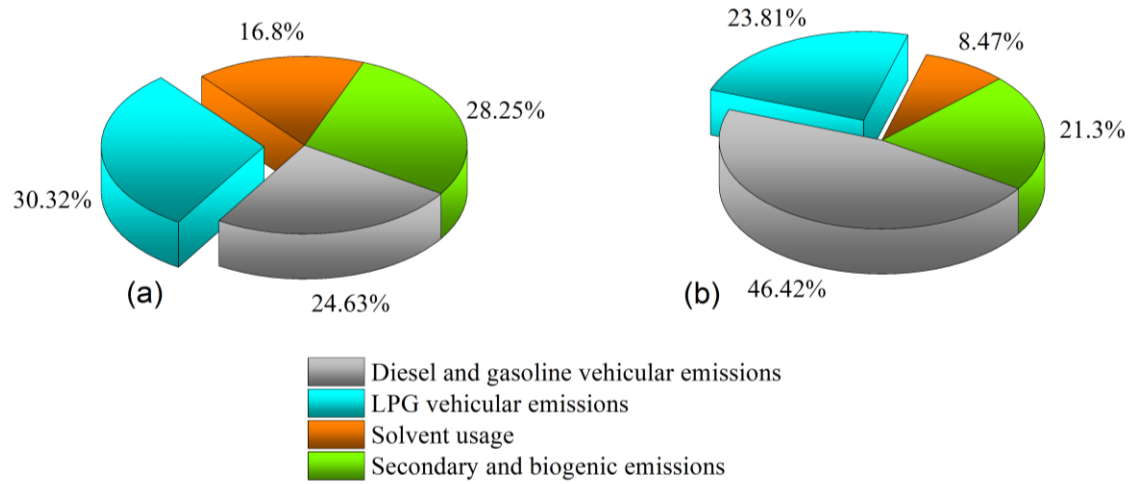
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75 **Figure 11.** OFP of roadside VOCs from different sources at MKAQMS (a) before and  
 76 (b) after the LPG CCRP based on PMF results.

**Supplementary material for on-line publication only**

[Click here to download Supplementary material for on-line publication only: Supplementary material 20200907\\_revised.docx](#)



### **Conflict of interest statement**

We declare that we have no financial and personal relationships with other people or organizations that can inappropriately influence our work, there is no professional or other personal interest of any nature or kind in any product, service and/or company that could be construed as influencing the position presented in, or the review of the manuscript entitled “The Characteristics and Sources of Roadside VOCs in Hong Kong: Effect of the LPG Catalytic Converter Replacement Programme”.

## **Credit Author Statement**

Long Cui: Data curation; Formal analysis; Methodology; Writing - original draft. Hai Wei Li: Software; Writing - review & editing. Yu Huang: Funding acquisition; Investigation; Writing – editing. Zhou Zhang: Validation; Visualization. Shun Cheng Lee: Project administration; Funding acquisition; Supervision. Donald Ray Blake: Methodology; Writing – review. Xin Ming Wang: Software, Validation. Kin Fai Ho: validation; Visualization. Jun Ji Cao: Visualization; Writing – editing.

**Declaration of interests**

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.

The authors declare the following financial interests/personal relationships which may be considered as potential competing interests: