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Article Characteristics of PM_{2.5} and Black Carbon Exposure Among Subway Workers

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Abstract: This study aimed to assess the characteristics of exposure to both $PM_{2.5}$ and black carbon (BC) among subway workers. A total of 61 subway workers, including 26, 23, and 12 subway station managers, maintenance engineers, and train drivers, respectively, were investigated in 2018. Real-time measurements of airborne $PM_{2.5}$ and BC were simultaneously conducted around the breathing zones of workers. Maintenance engineers had the highest average levels of exposure to both $PM_{2.5}$ and BC ($PM_{2.5}$, 76 µg/m³; BC, 9.3 µg/m³), followed by train drivers (63.2 µg/m³, 5.9 µg/m³) and subway station managers (39.7 µg/m³, 2.2 µg/m³). In terms of the relationship between mass concentrations of $PM_{2.5}$ and BC, train drivers demonstrated the strongest correlation (R = 0.72), indicating that the proportion of BC contained in $PM_{2.5}$ is relatively steady. The average proportion of BC in $PM_{2.5}$ among maintenance engineers (13.0%) was higher than that among train drivers (9.4%) and subway station managers (6.4%). Univariate and mixed effect multiple analyses demonstrated the type of task and worksite to be significant factors affecting exposure levels in maintenance engineers and subway station managers. The use of diesel engine motorcars in tunnel maintenance was found to be a key contributor to $PM_{2.5}$ and BC exposure levels among subway workers.

Keywords: black carbon; PM2.5; subway; diesel engine motorcar

1. Introduction

In metropolitan areas, subways have become an indispensable form of transport as they reduce traffic congestion and improve air quality by reducing emissions from gasoline and diesel engines [1]. Recently, Lu et al. (2018) reported that adding new openings in the subway systems in Chinese cities between 2013 to 2017 reduced $PM_{2.5}$ concentrations by an average of 18 µg/m³ and significantly improved air quality [2]. The Seoul Metropolitan subway is one of the largest metro traffic systems in the world. It comprises 22 lines, and serves Seoul, Incheon, and satellite cities in the Gyeonggi province. Most of the metropolitan subway stations in the Republic of Korea are situated deep underground. As metro traffic systems have expanded, there have been increasing concerns regarding underground air quality and the health risks of passengers [3,4].

Many studies have been conducted worldwide, including in the Republic of Korea, regarding the harmful substances and human health risks in the environment of the subway systems [5]. One of

the major hazardous agents that both subway workers and passengers are exposed to is particulate matter (PM) of diverse sizes and chemical compositions. Smaller fractions of PM ($PM_{2.5}$ and $PM_{1.0}$) deserve particular attention as these particles may penetrate deep into the bronchiolar areas of the lung, causing various health hazards [6]. The PM generated in subway work environments include diesel engine exhaust (DEE) emissions, particles generated from friction during the movement of trains, and above ground PM infiltrating subway environments. Diesel engine vehicles are widely used for tunnel maintenance after completion of routine daily operations. The International Agency for Research on Cancer has reclassified DEE as "carcinogenic to humans (group 1)" based on sufficient evidence that exposure is associated with an increased risk of lung cancer [7].

Numerous studies have evaluated DEE exposures in various jobs using its primary surrogates (occasionally interchangeably), such as black carbon (BC), elemental carbon, total carbon, respirable particulate matter, and nitrogen dioxide. Studies have found that DEE exposures among underground miners and tunnel construction workers are markedly higher than those in aboveground truck/bus drivers, truck/bus garage mechanics, fire fighters, and heavy equipment operators [8–13]. However, few studies have assessed DEE exposure among subway workers; in particular, exposures to BC and PM_{2.5} have not been simultaneously evaluated in these workers.

The main sources of environmental BC are the incomplete combustion of fossil-based fuels and the burning of biomass on the Earth's surface [14]. BC from vehicle exhausts originates from the combustion of diesel, gasoline, and other petroleum-based fuel materials that contain carbonaceous particles with attached polycyclic aromatic hydrocarbons (PAHs) [15]. Exhaust fumes from vehicles, including diesel engines operated both above ground and underground, could be the main source of BC in the subway environment. Exposure to BC has been closely linked with various adverse effects on health, including cancer development [16], lowered lung function [17], acute respiratory inflammation [18,19], wheezing [20], asthma exacerbation [21], decreased cognitive function [22], and attention problems [23].

According to the Korea Workers' Compensation and Welfare Service, 10 cases of respiratory diseases (lung cancer = 8, idiopathic pulmonary fibrosis = 1, and chronic respiratory failure = 1) were reported from 2007 to 2012 as work-related diseases among subway workers [24]. However, studies on the air quality of subways have largely focused on its impact on the general population. Studies on workers who stay in the underground environment for longer periods than the general population are scarce. This study aimed to assess the daily exposure of subway workers to both $PM_{2.5}$ and BC. It also aimed to evaluate the job- and subway-related environmental factors influencing $PM_{2.5}$ and BC exposures and to evaluate the relationship between exposure to $PM_{2.5}$ and BC.

2. Materials and Methods

2.1. Description of Subway Jobs

Subway workers in the Republic of Korea may be categorized into three types based on their jobs: maintenance engineers, subway station managers, and train drivers. Maintenance engineers may be further classified based on the various subway facilities that they manage, including equipment, machines, railways, and tunnels, among others. Exposure characteristics of hazardous agents among maintenance engineers may vary depending on the tasks they perform. The categories of maintenance work that this study focused on included the repair and maintenance of underground tunnels at night, after the completion of routine daily operations. These tasks are performed using diesel vehicles. Subway station managers mostly stay in offices located near ticket boxes and regularly patrol the entire length of the subway stations, including the platforms. They may be exposed to hazardous agents generated in subway stations that may vary depending on the location of the subway. Two shift work cycles operate between 5 a.m. to around midnight, from the beginning to the end of daily subway operations. Train drivers operate the trains according to irregular shift schedules, known as train diagrams. They work from small cabin rooms during the entire duration of their duty hours. Therefore,

the characteristics of exposure to hazardous agents depends on the various facility characteristics of several stations along the subway route.

2.2. Exposure Assessment Strategy

A total of 61 subway workers, including 26 subway station managers, 23 maintenance engineers, and 12 train drivers working on the Seoul, Bundang, and Incheon city lines, were investigated between April and September 2018. The subway workers (n = 61) with shifts scheduled when the measurements were being conducted were all selected to participate in the study. The basic characteristics of the subway lines surveyed in this study are summarized in Table 1.

| Region | Line | Operating Company | Opening Year | Number of Stations |
|-----------------|--------------------------|--------------------------------|--------------|-----------------------|
| Seoul | 1 | Seoul Metro | 1974 | 10 |
| | 1 (Gyeongbu line) | KORAIL | 1974 | 37 |
| | 1 (Gyeongin line) | KORAIL | 1974 | 21 |
| | 1 (Gyeongwon line) | KORAIL | 1974 | 25 |
| | 1 (Janghang line) | KORAIL | 2008 | 7 |
| | 2 | Seoul Metro | 1980 | 44 |
| | 2 (Seongsu branch line) | Seoul Metro | 1980 | 5 |
| | 2 (Sinjeong branch line) | Seoul Metro | 1992 | 5 |
| | 3 | Seoul Metro | 1985 | 34 |
| | 3 (Ilsan line) | KORAIL | 1996 | 11 |
| | 4 | Seoul Metro | 1985 | 26 |
| | 4 (Gwacheon line) | KORAIL | 1993 | 10 |
| | 4 (Ansan line) | KORAIL | 1988 | 14 |
| | 5 | Seoul Metro | 1995 | 44 |
| | 5 (Macheon branch line) | Seoul Metro | 1996 | 8 |
| | 6 | Seoul Metro | 2000 | 38 |
| | 7 | Seoul Metro | 1996 | 51 |
| | 9 | Metro 9 | 2009 | 30 |
| Seoul, Gyeonggi | Bundang | KORAIL | 1994 | 36 |
| Incheon | 1 | Incheon Transit Corporation | 1999 | 29 |

Table 1. Basic characteristics of subway lines surveyed in this study.

Real-time airborne $PM_{2.5}$ and BC concentrations were both simultaneously monitored during working hours to capture differences in time-activity patterns, based on jobs and locations of on-duty workers. On the sampling day, workers were asked to carry two samplers for each $PM_{2.5}$ and BC, equipped with a tube fitted near the breathing zone to estimate inhalational exposures. Simultaneously, a time-activity diary was completed by workers in a provided form. Information registered in the time-activity diary included the main tasks, the beginning and ending times for each job, and the locations they worked at or visited while on duty. The accuracy of information was verified by consulting the logged measurement levels.

2.3. PM_{2.5} Measurement

 $PM_{2.5}$ concentrations were measured using a SidePak personal aerosol monitor (Model AM510 or AM520, TSI Inc., Shoreview, MN, USA) fitted with a 2.5 µm impactor. The impactor was cleaned and greased prior to each use and was set to an airflow rate of 1.7 L/min. Prior to each measurement with the included high efficiency particulate air filter, the instrument was calibrated to zero. SidePak monitors are light-scattering laser photometers with a resolution of 1 µg/m³. The data obtained from the SidePak AM520 m were multiplied by a photometric calibration factor (PCF) of 0.38. The purpose of the PCF is to compensate when measuring for aerosols that have different photometric properties than those used during factory calibration. The manufacturer recommended that a PCF of 0.38 be used

for the ambient aerosols present in the urban environment [25]. All SidePaks used in this study were calibrated by the manufacturer within the recommended yearly intervals. The recorded data were downloaded to personal computers and analyzed using TrakPro or TrakPro 5 software (TSI Inc.).

2.4. BC Measurement

The BC levels were monitored using an aethalometer (microAeth model AE51, Magee Scientific, Berkeley, CA, USA). This instrument measures the intensity of light (880 nm wavelength) transmitted through a T60 Teflon-coated glass fiber and reports BC concentrations in ng/m³. The detection limit of the aethalometer was 1 ng/m³. The manufacturer's default specific attenuation coefficient of 16.6 m²/g was used. To enhance the sensitivity, the air sampling rate was set at 0.15 L/min. Real-time measurements were recorded every minute. Since the instrument was small and portable (280 g), it was possible to use it to directly monitor the daily personal exposure to BC while workers moved through different zones of activity with varying BC concentrations. The filter strips were replaced prior to each sampling to minimize the filter loading effect. To test the precision of monitoring, the results from four micro-aethalometers were intercompared.

2.5. Data Analysis

Real-time measurements of both PM_{2.5} and BC were simultaneously recorded for 1 min each during working hours. The data were downloaded soon after monitoring to minimize data handling errors or recall bias. The three data values of "0" in the BC measurements were changed to half of the detection limit of 1 ng/m³, as previously described [26]. A total of 14,085 measurements on one timescale were finally included in this study. The data pertaining to PM_{2.5} and BC were found to have a right-skewed distribution, indicating frequent high-level exposures. Therefore, the data were natural log-transformed for statistical analyses to better fit the normal distribution. The data were presented as descriptive statistics, including the arithmetic mean (AM), standard deviation (SD), geometric mean (GM), geometric standard deviation (GSD), minimum (Min) value, and maximum (Max) value. To identify work activities and potential environmental risk factors that contribute to exposure, all PM_{2.5} and BC records were classified according to the following several categories: (i) temporal factors: type of day, time of day, and rush hour; (ii) subway environmental factors: subway line, location of subway (underground or at ground level); and (iii) job: subway station manager, maintenance engineer, and train driver.

A linear mixed model was used to compare average natural logarithm-transformed $PM_{2.5}$ and BC exposure levels according to categorized jobs, tasks, and environmental factors; correlations between repeated measurements at the same working or visited locations over time were modeled by a first-order autoregressive covariance structure with random effects. Sequential likelihood ratio tests (LRTs) were conducted to assess: (1) whether a linear mixed model was preferred for analyses over a linear regression model without random effects, and (2) the impact of potential risk factors on $PM_{2.5}$ and BC exposures while accounting for subway features, such as line, on the basis of the test results of a random effect. For each model, residuals were thoroughly assessed to check the model's assumptions, such as linearity and normality. The level of significance was set at 0.05 and all statistical analyses were performed using the R version 3.5.1. (R Foundation for Statistical Computing, Vienna, Austria) software package.

3. Results

3.1. PM_{2.5} and BC Exposure Characteristics

The distribution of levels of exposure to $PM_{2.5}$ and BC according to job are presented in Figure 1. The details of the association between exposure levels and subway environmental factors are summarized in Table 2.

The average PM_{2.5} and BC levels were 50.5 (range: 1.9–2774) μ g/m³ and 4.3 (range: 0.0005–283.1) μ g/m³, respectively. The exposure levels of both PM_{2.5} and BC were significantly different among the types of jobs (p < 0.0001) (Figure 1).

Maintenance engineers demonstrated the highest AM concentrations and the largest variations in both $PM_{2.5}$ (AM = 76 µg/m³, SD = 139.2 µg/m³) and BC (AM = 9.3 µg/m³, SD = 19.3 µg/m³) (Table 2). Subway station managers showed the lowest average exposure levels to both $PM_{2.5}$ (AM = 39.7 µg/m³, SD = 34.0 µg/m³) and BC (AM = 2.2 µg/m³, SD = 2.4 µg/m³). The GM of the concentrations of $PM_{2.5}$ (54.9 µg/m³) and BC (4.9 µg/m³) was the highest among train drivers, with the lowest variation in $PM_{2.5}$ (3.5–200.9 µg/m³).

In maintenance engineers and subway station managers, the type of task and the worksites where they spent their working hours were found to be the most significant factors affecting exposure to $PM_{2.5}$ and BC. In subway station managers, the time variable was also found to contribute significantly to exposure levels of $PM_{2.5}$ and BC (p < 0.001) (Table 2).

Among maintenance engineers and subway station managers, the linear mixed effects model also demonstrated task type to be the most significant factor associated with the exposure levels of $PM_{2.5}$ and BC (p < 0.01) (Table 3). In maintenance engineers, a 10.3-fold higher GM of $PM_{2.5}$ was seen with rail grinding than with gravel work, whereas in subway station managers, a 1.146-fold higher GM of $PM_{2.5}$ was seen with patrolling than with monitoring; the observations for BC concentrations were similar. After adjusting for subway line in the linear mixed model, the time variable was not a significant factor for $PM_{2.5}$ (p = 0.927) and BC (p = 0.287) exposure among train drivers.



Figure 1. Distribution of (**a**) PM_{2.5} and (**b**) black carbon exposure levels according to job. Dashed lines show the arithmetic mean. * *p*-values were obtained using the likelihood ratio test. (**a**) PM_{2.5} (p < 0.001 *); (**b**) black carbon (p < 0.001 *).

| Job | PM _{2.5} , μg/m ³ | | | | | | | | | BC, μg/m ³ | | | | | | | |
|-----------|---------------------------------------|-----------|------------|-------|-------|-------|-----|------|--------|-----------------------|------|------|------|-----|--------|-------|-----------------|
| | | N. sub | N. meas | AM | SD | GM | GSD | Min | Max | <i>p</i> -value * | AM | SD | GM | GSD | Min | Max | <i>p</i> -value |
| Mainte | enance engineers | 23 | 3173 | 76.0 | 139.2 | 49.2 | 2.2 | 1.9 | 2774.0 | | 9.3 | 19.3 | 4.0 | 3.3 | 0.0005 | 283.1 | |
| Line | Incheon 1 | 5 | 713 | 40.5 | 17.7 | 37.4 | 1.5 | 19.0 | 202.0 | 0.106 | 5.1 | 5.4 | 3.2 | 3.0 | 0.0005 | 49.6 | 0.009 |
| | Seoul 2 | 6 | 1281 | 62.9 | 124.8 | 47.5 | 1.9 | 5.0 | 2774.0 | | 7.0 | 10.2 | 3.7 | 2.9 | 0.036 | 84.0 | |
| | Seoul 3 | 5 | 420 | 75.0 | 23.8 | 71.5 | 1.4 | 36.0 | 166.0 | | 12.5 | 15.9 | 6.3 | 3.4 | 0.21 | 86.0 | |
| | Seoul 4 | 3 | 421 | 184.6 | 288.3 | 47.5 | 5.7 | 1.9 | 1738.0 | | 25.3 | 42.8 | 7.0 | 5.4 | 0.34 | 283.1 | |
| | Seoul 9 | 4 | 338 | 66.9 | 10.8 | 66.0 | 1.2 | 38.0 | 90.0 | | 3.2 | 2.0 | 2.8 | 1.7 | 0.64 | 15.4 | |
| Worksites | Inside motorcar | 15 | 1407 | 77.2 | 122.4 | 45.8 | 2.6 | 1.9 | 866.4 | < 0.001 | 9.1 | 18.3 | 3.9 | 3.4 | 0.0005 | 283.1 | < 0.001 |
| | Outside motorcar | 18 | 1766 | 75.1 | 151.3 | 52.1 | 2.0 | 5.0 | 2774.0 | | 9.4 | 20.0 | 4.2 | 3.2 | 0.036 | 263.3 | |
| Task | Gravel work | 2 | 438 | 44.8 | 26.2 | 37.0 | 1.9 | 5.0 | 163.0 | < 0.001 | 8.0 | 8.4 | 5.0 | 2.7 | 0.19 | 52.7 | < 0.001 |
| | Moving | 11 | 778 | 79.7 | 84.3 | 57.9 | 2.3 | 1.9 | 832.0 | | 10.2 | 19.2 | 4.5 | 3.3 | 0.21 | 283.1 | |
| | Preparation | 19 | 1724 | 71.9 | 143.0 | 46.3 | 2.1 | 2.7 | 2774.0 | | 7.5 | 14.0 | 3.4 | 3.2 | 0.0005 | 248.9 | |
| | Rail grinding | 1 | 55 | 469.2 | 457.9 | 253.3 | 3.5 | 32.0 | 1738.0 | | 77.5 | 68.2 | 42.5 | 3.7 | 3.34 | 263.3 | |
| | Watering | 2 | 178 | 55.1 | 14.2 | 53.3 | 1.3 | 27.0 | 104.0 | | 5.4 | 5.8 | 3.5 | 2.5 | 0.51 | 28.3 | |
| Subway | y station manager | 26 | 9330 | 39.7 | 34.0 | 33.7 | 1.7 | 4.0 | 1402.0 | | 2.2 | 2.4 | 1.8 | 1.9 | 0.0005 | 75.5 | |
| Line | Bundang | 2 | 644 | 31.8 | 16.7 | 29.5 | 1.5 | 8.0 | 353.0 | 0.006 | 2.9 | 3.9 | 2.3 | 2.2 | 0.046 | 70.6 | 0.182 |
| | Incheon 1 | 2 | 622 | 69.4 | 76.9 | 59.1 | 1.6 | 29.0 | 1402.0 | | 2.0 | 4.4 | 1.6 | 1.6 | 0.14 | 73.2 | |
| | Seoul 3 | 6 | 2177 | 49.8 | 20.8 | 46.2 | 1.5 | 9.0 | 225.0 | | 2.9 | 2.4 | 2.4 | 1.9 | 0.0005 | 75.5 | |
| | Seoul 4 | 4 | 1267 | 42.1 | 27.6 | 35.8 | 1.8 | 9.0 | 410.0 | | 2.7 | 1.9 | 2.2 | 2.0 | 0.23 | 28.4 | |
| | Seoul 5 | 3 | 1178 | 20.6 | 5.9 | 19.8 | 1.3 | 4.0 | 60.0 | | 1.3 | 0.8 | 1.2 | 1.6 | 0.0005 | 17.2 | |
| | Seoul 6 | 3 | 1343 | 34.4 | 12.4 | 32.4 | 1.4 | 15.0 | 76.0 | | 1.7 | 0.7 | 1.5 | 1.6 | 0.062 | 4.7 | |
| | Seoul 7 | 2 | 644 | 50.0 | 30.0 | 41.0 | 1.9 | 14.0 | 120.0 | | 2.2 | 0.9 | 2.0 | 1.5 | 0.20 | 10.3 | |
| | Seoul 9 | 4 | 1455 | 28.7 | 42.9 | 24.1 | 1.6 | 9.0 | 1256.0 | | 1.9 | 2.5 | 1.5 | 1.9 | 0.11 | 66.4 | |
| Location | Ground | 5 | 151 | 49.0 | 115.7 | 29.1 | 2.2 | 10.0 | 1256.0 | 0.025 | 1.8 | 1.3 | 1.5 | 1.8 | 0.53 | 11.3 | 0.327 |
| | Underground | 26 | 9179 | 39.5 | 30.9 | 33.8 | 1.7 | 4.0 | 1402.0 | | 2.3 | 2.4 | 1.8 | 1.9 | 0.0005 | 75.5 | |
| Worksite | Office | 26 | 5495 | 36.1 | 21.2 | 31.9 | 1.6 | 7.0 | 410.0 | < 0.001 | 2.2 | 2.0 | 1.8 | 1.9 | 0.0005 | 70.6 | < 0.001 |
| | Outdoors | 5 | 151 | 49.0 | 115.7 | 29.1 | 2.2 | 10.0 | 1256.0 | | 1.8 | 1.3 | 1.5 | 1.8 | 0.53 | 11.3 | |
| | Passageway | 26 | 2812 | 39.8 | 26.6 | 33.7 | 1.8 | 4.0 | 583.0 | | 2.1 | 2.7 | 1.7 | 1.8 | 0.046 | 73.2 | |
| | Platform | 20 | 872 | 59.8 | 66.8 | 48.0 | 1.9 | 9.0 | 1402.0 | | 3.2 | 3.2 | 2.6 | 1.9 | 0.19 | 75.5 | |
| Time | Rush hour ** | 26 | 3133 | 35.4 | 18.4 | 31.7 | 1.6 | 6.0 | 353.0 | < 0.001 | 2.1 | 2.3 | 1.8 | 1.8 | 0.14 | 73.2 | < 0.001 |
| | Others | 26 | 6197 | 41.8 | 39.4 | 34.7 | 1.8 | 4.0 | 1402.0 | | 2.3 | 2.4 | 1.8 | 2.0 | 0.0005 | 75.5 | |
| Task | Monitoring | 26 | 5412 | 35.8 | 20.9 | 31.7 | 1.6 | 7.0 | 410.0 | < 0.001 | 2.2 | 2.0 | 1.8 | 1.9 | 0.0005 | 70.6 | < 0.001 |
| | Patrolling | 26 | 3687 | 45.3 | 46.6 | 36.9 | 1.9 | 4.0 | 1402.0 | | 2.4 | 2.9 | 1.9 | 1.9 | 0.046 | 75.5 | |
| | Rest | 10 | 231 | 40.1 | 29.6 | 32.6 | 1.9 | 10.0 | 207.0 | | 1.8 | 1.2 | 1.5 | 1.8 | 0.086 | 10.0 | |

Table 2. Summary of exposure levels to $PM_{2.5}$ and black carbon according to job and task.

| Job | | PM _{2.5} , μg/m ³ | | | | | | | | | | | BC, μg/m | 3 | | | |
|--------|-------------|---------------------------------------|------------|-------|------|-------|-----|------|--------|-------------------|------|-----|----------|-----|--------|-------|-----------------|
| | | N. sub | N. meas | AM | SD | GM | GSD | Min | Max | <i>p</i> -value * | AM | SD | GM | GSD | Min | Max | <i>p-</i> value |
| Ti | rain driver | 12 | 1582 | 63.2 | 33.0 | 54.9 | 1.7 | 3.5 | 200.9 | | 5.9 | 4.2 | 4.9 | 1.9 | 0.012 | 52.5 | |
| Line | Bundang | 1 | 96 | 39.3 | 9.2 | 38.1 | 1.3 | 20.5 | 54.8 | 0.181 | 3.0 | 0.9 | 2.8 | 1.9 | 0.012 | 5.4 | 0.003 |
| | Incheon 1 | 2 | 218 | 44.3 | 11.9 | 42.6 | 1.3 | 20.0 | 68.2 | | 4.6 | 1.6 | 4.2 | 1.7 | 0.071 | 8.4 | |
| | Seoul 1 | 1 | 171 | 77.3 | 16.3 | 75.7 | 1.2 | 48.7 | 120.9 | | 4.3 | 1.4 | 4.1 | 1.4 | 1.79 | 8.6 | |
| | Seoul 2 | 1 | 179 | 42.0 | 24.1 | 34.6 | 2.0 | 3.5 | 99.2 | | 6.6 | 3.5 | 5.5 | 2.0 | 0.37 | 13.9 | |
| | Seoul 3 | 1 | 162 | 108.9 | 30.1 | 104.1 | 1.4 | 35.8 | 200.9 | | 15.0 | 4.7 | 14.2 | 1.4 | 5.06 | 28.6 | |
| | Seoul 4 | 2 | 267 | 75.7 | 46.4 | 60.6 | 2.0 | 13.5 | 182.7 | | 5.5 | 4.1 | 4.4 | 2.0 | 0.19 | 52.5 | |
| | Seoul 5 | 1 | 185 | 45.0 | 17.3 | 42.0 | 1.5 | 19.3 | 93.5 | | 4.1 | 1.4 | 3.9 | 1.4 | 1.89 | 7.1 | |
| | Seoul 7 | 1 | 171 | 74.3 | 9.8 | 73.7 | 1.1 | 55.7 | 98.1 | | 5.7 | 1.6 | 5.4 | 1.4 | 1.79 | 10.9 | |
| | Seoul 9 | 2 | 133 | 51.5 | 11.4 | 50.4 | 1.2 | 29.0 | 118.9 | | 4.1 | 1.0 | 4.0 | 1.3 | 1.26 | 7.3 | |
| Time 1 | Rush hour | 12 | 824 | 57.8 | 28.4 | 50.6 | 1.7 | 3.5 | 168.8 | < 0.001 | 5.6 | 4.0 | 4.7 | 1.9 | 0.071 | 28.6 | 0.587 |
| | Others | 10 | 758 | 69.0 | 36.5 | 60.0 | 1.7 | 13.5 | 200.9 | | 6.3 | 4.4 | 5.1 | 2.0 | 0.012 | 52.5 | |
| Time 2 | Forenoon | 6 | 862 | 68.9 | 31.1 | 61.0 | 1.7 | 3.5 | 200.9 | 0.446 | 7.1 | 4.8 | 5.9 | 1.8 | 0.37 | 28.6 | 0.082 |
| | Afternoon | 6 | 720 | 56.3 | 33.9 | 48.5 | 1.7 | 13.5 | 182.7 | | 4.5 | 2.9 | 3.9 | 1.9 | 0.012 | 52.5 | |
| Total | | 61 | 14085 | 50.5 | 74.1 | 38.7 | 1.9 | 1.9 | 2774.0 | | 4.3 | 9.9 | 2.4 | 2.5 | 0.0005 | 283.1 | |

Table 2. Cont.

Abbreviations: N. sub: number of subjects, N. meas: number of measurements, AM: arithmetic mean, SD: standard deviation, GM: geometric mean, GSD: geometric standard deviation, Min: minimum, Max: maximum. * *p*-values were obtained using the likelihood ratio test considering correlations between measurements on the same subject. ** Rush hour: 07–09 a.m. to 06–08 p.m.

| Job | Variable | Level | | PM _{2.5} , μg | /m ³ | BC, μ g/m ³ | | | | | |
|----------------|---------------|---------------|----------|------------------------|----------------------|----------------------------|-------|-----------------|--|--|--|
| | | | Estimate | SE | <i>p</i> -Value **** | Estimate | SE | <i>p</i> -Value | | | |
| | Task * | Moving | 1.124 | 1.454 | < 0.001 | 0.497 | 1.457 | 0.007 | | | |
| Maintenance | | Preparation | 1.425 | 1.448 | | 0.633 | 1.440 | | | | |
| engineers | | Rail grinding | 10.328 | 1.752 | | 2.964 | 2.276 | | | | |
| | | Watering | 1.411 | 1.661 | | 0.751 | 1.655 | | | | |
| Subway station | Task ** | Patrolling | 1.146 | 1.007 | < 0.001 | 1.165 | 1.009 | < 0.001 | | | |
| managers | | Rest | 1.073 | 1.024 | | 0.996 | 1.031 | | | | |
| Train drivers | Time 2 *** | Afternoon | 1.023 | 1.843 | 0.927 | 0.852 | 1.426 | 0.287 | | | |

Table 3. Multiplicative effects of factors on the GM of PM_{2.5} and BC exposure levels using linear mixed model analysis [†].

[†] For each job-specific analysis, a linear mixed model was found to be a better fit than a linear regression model (p < 0.001). * The reference level was "gravel work"; line and worksite were adjusted in the linear mixed model. ** The reference level was "monitoring"; line, worksite, and time were adjusted in the linear mixed model. *** The reference level was "forenoon"; line was adjusted in the linear mixed model. *** The *p*-value of the likelihood ratio test has been reported.

3.2. Relationship between PM_{2.5} and BC Exposures by Job

Figure 2 illustrates the correlation between the mass concentrations of $PM_{2.5}$ and BC on the log scale by job. The correlation coefficients between jobs were calculated after conducting linear regression among 61 subjects. Train drivers demonstrated the strongest correlation (R = 0.72), followed by maintenance engineers (R = 0.61) and subway station managers (R = 0.4).



Figure 2. Correlation between the mass concentrations of PM_{2.5} and black carbon (BC) by job.

The proportion of BC contained in $PM_{2.5}$ in the 61 subjects ranged from 2.5% to 30.2% (Table 4). The average proportion of BC in $PM_{2.5}$ among maintenance engineers was significantly higher than that in the other jobs (maintenance engineers vs. subway station managers vs. train drivers: 13.0% vs. 6.4% vs. 9.4%).

Figure 3 displays the temporal exposure pattern of mass concentrations of $PM_{2.5}$ and BC from data observed in representative cases, with the peak exposures by jobs. Several peaks of relatively high levels were generally observed in short periods of time during the entire work duration.

| Job * | Task | | , D | | |
|----------------------------|---------------|--------|--------|------|------|
| | | N. sub | AM | Min | Max |
| Maintenance engineers | Subtotal | 23 | 13.0 | 3.6 | 30.2 |
| 0 | Gravel work | 2 | 19.3 | 15.4 | 23.1 |
| | Moving | 11 | 13.6 | 3.6 | 26.3 |
| | Preparation | 19 | 11.5 | 3.3 | 36.9 |
| | Rail grinding | 1 | 16.5 | 16.5 | 16.5 |
| | Watering | 2 | 10.4 | 5.6 | 15.3 |
| Subway station managers | Subtotal | 26 | 6.4 | 2.5 | 15.7 |
| C C | Monitoring | 26 | 6.4 | 1.9 | 18.2 |
| | Patrolling | 26 | 6.4 | 2.1 | 13.4 |
| | Rest | 10 | 4.8 | 1.9 | 8.8 |
| Train drivers | Subtotal | 12 | 9.4 | 5.6 | 15.8 |
| | Driving | 12 | 9.4 | 5.6 | 15.8 |
| Total | 0 | 61 | 9.5 | 2.5 | 30.2 |

Table 4. Mass concentrations of BC in PM_{2.5} according to job and tasks.

Abbreviations: N. sub: number of subjects, AM: arithmetic mean, Min: minimum, Max: maximum. * p < 0.001 on analysis of variance.

As seen in Figure 3a, peak exposures to $PM_{2.5}$ and BC were higher in maintenance engineers than in the other workers. In particular, the $PM_{2.5}$ and BC concentrations increased more than 100-fold during grinding of rails outside the diesel engine motorcar. As demonstrated in Figure 3b, the highest peak levels of $PM_{2.5}$ (177.0 µg/m³) and BC (75.5 µg/m³) in subway station managers were observed during platform patrolling. As depicted in Figure 3c, train drivers showed relatively low diurnal variations in both $PM_{2.5}$ and BC. Figure 3 demonstrates the correlation between the mass concentrations of $PM_{2.5}$ and BC for each job, irrespective of tasks.



Figure 3. Cont.



Figure 3. Real-time patterns of exposure to PM_{2.5} and BC according to job. (**a**) Maintenance engineers; (**b**) subway station managers; (**c**) train drivers.

4. Discussion

This study assessed daily integrated levels of inhalational exposures to $PM_{2.5}$ and BC among subway workers and explored the relationships between them according to jobs, tasks, locations, and time variables. Several factors were found to significantly influence the levels of exposure to $PM_{2.5}$ and BC.

Type of job was found to be closely associated with levels of exposure to both $PM_{2.5}$ and BC and with the relationship between $PM_{2.5}$ and BC. Maintenance engineers demonstrated the highest levels of exposure to both $PM_{2.5}$ and BC, followed by train drivers and subway station managers (Figure 1 and Table 2). The proportions of the mass concentrations of BC in $PM_{2.5}$ indicated similar trends across the three jobs (Table 4). In terms of the relationship between the mass concentrations of $PM_{2.5}$ and BC,

train drivers showed the strongest correlation (R = 0.72), indicating that the proportion of BC contained in PM_{2.5} is relatively steady (Figure 2). The average proportion of BC in PM_{2.5} among maintenance engineers (13.0%) was higher than that among train drivers (9.4%) and subway station managers (6.4%). When the proportions of BC were monitored across 24 sites of EUROAIRNET in Europe; it was found to contribute to 5%–10% of PM_{2.5} and to lower proportions of PM with an aerodynamic diameter smaller than 10 μ m (PM₁₀) [27]. In particular, at some of the curbside sites, the proportion of BC in PM_{2.5} was 17%; this was similar to our results, which demonstrated a relative contribution of 16.5% among maintenance engineers who worked near diesel engine motor cars during rail grinding (Table 4).

In general, maintenance engineers use diesel engine motorcars while working inside tunnels. Since this maintenance work takes place at night when the electric power is switched off, the maintenance vehicle uses its own power; therefore, the diesel engines run throughout the duration of work. Our findings suggest that while working inside or close to diesel motorcars, maintenance engineers may be exposed to high levels of BC, exceeding 200 µg/m³ (Table 2). Interestingly, as seen in Figure 3a, the levels of exposure to BC during the rail grinding operation (54.7 μ g/m³) were observed to be similar to the levels of exposure to $PM_{2.5}$ (62.0 μ g/m³) among all workers. These results demonstrate that maintenance engineers who maintain subway tunnels are generally exposed to high levels of DEE, with consequent high exposure to ultra-fine PM and BC. DEE contains respirable particles, of which 80%–95% are fine and measure <2.5 µm [28,29]. In this study, diesel particulate filters (DPFs) were not installed on all the diesel engine motorcars used by maintenance engineers. BC has been used as a surrogate indicator of DEE in the workplace [30,31]; PM_{2.5} may also be used to determine DEE exposures [32–34]. The use of diesel vehicles during tunnel maintenance was found to be a key contributor to the levels of exposure to BC and $PM_{2.5}$ among maintenance engineers. This result is in agreement with a previous study conducted in New York City (NYC) [3]. The NYC study showed that BC levels increase rapidly when a diesel maintenance train is in operation nearby; therefore, diesel maintenance trains are potentially important contributors to elevated BC levels in subway stations.

A linear mixed model was employed as the main statistical analytic tool for this study; statistical tests for both random (initial test) and fixed effects (subsequent test) were conducted for LRTs [35]. For all the analyses presented in Tables 2 and 3, linear mixed models fit the data better than linear regression models, implying that there were significant correlations among repeated PM_{2.5} or BC measurements. Readers should note that for a given analysis, both linear mixed and linear regression models had the same set of predictors, but differed only by a random effect. For the example of train drivers' exposure to PM_{2.5} in Table 3, variables Time2 and line were included as fixed effects in both models and, based on the LRT result that a linear mixed model had a better fit, the effect of Time2 on log-transformed PM_{2.5} was evaluated with another LRT in the presence of line as a covariate. Although data were not shown, no remarkable pattern was observed in the residual assessment of linear mixed models, indicating that model assumptions seemed to be satisfied.

Comparisons of PM_{2.5} and BC exposure levels according to job, tasks, worksites, and time provide accurate estimates of daily exposure levels. This study assessed the exposure of individual subway workers, so we did not evaluate air quality by sampling fixed areas at the platform or station hall. Therefore, workers' job characteristics were more important factors in understanding their exposure levels than the features of the subway line, such as the year it opened or the number of stations. Both univariate and linear mixed effect multiple analyses revealed tasks and worksites to be significant factors affecting exposure levels among maintenance engineers and subway station managers (Tables 2 and 3). Subway station managers showed the highest exposure levels during platform patrolling near tunnels, in which diesel engine motorcars were the primary sources of PM_{2.5} and BC. In train drivers, the PM_{2.5} and BC exposure pattern did not follow the general trend; the exposure to hazardous agents, including PM, did not increase with an increase in traffic volumes near the subway. Above ground, traffic volume directly affects the exposure level of commuters. For instance, Jereb et al. showed that traffic air pollution significantly influences cyclists riding near main roads [36]. Many studies

have found that underground air pollutant concentrations in subways are higher than aboveground levels [3,37,38]. Therefore, the pollutant concentration in underground air is affected not only by the amount of traffic above ground but also by ventilation in the subway system [39,40]. Among train drivers, the average levels of exposure to $PM_{2.5}$ and BC were comparatively lower during the rush hours than during other times (Table 2). However, as shown in Figure 3c, this difference was not significant. Similar results can be seen in the Shanghai subway study [38]. In the Shanghai study, due to the greater train frequency and passenger volume, the average PM_{2.5} levels at underground platforms during the rush hour period were significantly higher than those during the non-rush hour period. However, on clear days, the average PM_{2.5} levels in station halls during the rush hour period were significantly lower than those during the non-rush hour period. The researchers of the Shanghai study suggested that one possible explanation for this phenomenon could be increased air exchange caused by the stronger piston wind between the station hall and the outside environment at entrances/exits during the rush hour period. We think this could also be an explanation for the train drivers' exposure pattern observed in this study. The exposure level of train drivers may have been especially sensitive to the ventilation inside the tunnel because train drivers stayed in subway cabins for the entire sampling period.

No limits have been set for occupational exposures to $PM_{2.5}$ and BC. The Korean Ministry of Environment set the standard average value for the atmospheric levels of $PM_{2.5}$ over 24 h and one year to be 35 and 15 µg/m³, respectively [41]. In addition, for the first time, the Korean Indoor Air Quality standard for $PM_{2.5}$ in subway stations is planned to be set at a daily average of 50 µg/m³ from 2019 [42]. We speculate that the use of diesel engine vehicles for tunnel maintenance significantly contributes to the $PM_{2.5}$ and BC exposures among workers and passengers in the subway system. Vilcassim et al. suggested that diesel maintenance trains are a potentially important contributor to elevated BC levels in subway stations and that PM traps should be applied to diesel engines as one potential mitigation measure [3]. Our findings also indicate that installation of DPFs on diesel engine maintenance vehicles is warranted.

This study has several limitations. A major drawback lies in the uncertainty of whether the BC exposure levels among subway workers in this cohort are representative of all subway systems. These findings may not be generalizable to other subway environments with different workplace characteristics and physical environments in and around the subway. Since the 61 subway workers surveyed were not randomly selected, the PM_{2.5} and BC concentrations measured cannot be generalized as representative values for each job. The jobs and work patterns among subway workers may not be representative of those who work in environments with variable characteristics, such as depths, levels of ventilation, and transport modes surrounding the subway. The composition and generation of DEE varies depending on the age of the diesel engine, type of engine, fuel characteristics, driving cycle, and filtration of the exhaust. In addition, our monitoring period (from late spring to summer) did not encompass all the seasons of the year; this may also reduce the generalizability of our findings. Our data in the summer included personal PM_{2.5} and BC levels measured between April and September; this may have underestimated the daily BC exposure levels in the colder months, when reinforced heating and reduced ventilation are likely to increase exposure. Fromme et al reported that the concentrations of benzo-a-pyrene and elemental carbon monitored in the winter are three to four times higher than those in the summer, corresponding to the changes in ambient air concentrations in cars and subway transportation systems [43].

This study has certain strengths. It identified job type and use of diesel engine vehicles for tunnel maintenance to be potential risk factors for $PM_{2.5}$ and BC exposures among subway workers. To our knowledge, this study is the first to simultaneously assess the levels of exposure to both $PM_{2.5}$ and BC among subway workers by using synchronous real-time personal monitoring.

5. Conclusions

In conclusion, both the PM_{2.5} and BC exposure levels for subway workers were significantly different according to the type of job, the tasks conducted, and the worksite. Maintenance engineers had the highest exposure to both PM_{2.5} and BC, followed by train drivers, then subway station managers. In terms of the tasks and worksite, maintenance engineers and subway station managers showed the highest exposure levels during rail grinding in tunnels with diesel engine motorcars and patrolling platforms close to tunnels, respectively. This study also shows that the use of diesel engine motorcars during tunnel maintenance is a key contributor to PM_{2.5} and BC exposures among subway workers. Therefore, proactive measures, including installing DPFs on diesel engine maintenance vehicles in tunnels, are urgently needed to reduce subway workers' exposure to both PM_{2.5} and BC. Further studies on other subway systems are needed to validate our findings.

Author Contributions: D.-U.P. and S.C. conceived and designed the study; S.-Y.K., D.K., and H.K. performed field monitoring of PM_{2.5} and BC levels; K.-H.L. and S.C. analyzed the monitoring data; and J.-H.P. provided advice regarding statistical analysis.

Conflicts of Interest: The authors declare no conflicts of interest.

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