



# Article Efficacy of HEPA Air Cleaner on Improving Indoor Particulate Matter 2.5 Concentration

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**Abstract:** High-efficiency particulate air (HEPA) filters is a potential tool used to remove fine particles and improve indoor air quality. This study aims to analyze the real-world efficacy of portable HEPA air cleaners in a household environment. Laser light dispersion  $PM_{2.5}$  sensors are used to continuously monitor the indoor and outdoor  $PM_{2.5}$  level before and after HEPA air cleaner filtration. Overall, HEPA air cleaners significantly reduce the indoor  $PM_{2.5}$  level (33.5 ± 10.3 vs.  $17.2 \pm 10.7 \,\mu\text{g/m}^3$ , mean difference (MD) =  $-16.3 \,\mu\text{g/m}^3$ , *p* < 0.001) and indoor/outdoor  $PM_{2.5}\%$  (76.3 ± 16.8 vs. 38.6 ± 19.8%, MD = -37.7%, *p* < 0.001). The efficacy to reduce  $PM_{2.5}$  is strongest in three machines with medium-flow setting group (indoor  $PM_{2.5}$  MD:  $-26.5 \,\mu\text{g/m}^3$ , indoor/outdoor  $PM_{2.5}$ , percentage MD: -56.4%). Multiple linear regression demonstrates that outdoor  $PM_{2.5}$ , machine number, airflow speed, and window ventilation are significant factors associated with indoor  $PM_{2.5}$  concentrations (R = 0.879) and percentage of the indoor/outdoor  $PM_{2.5}$  ratio (R = 0.808). HEPA air cleaners can effectively improve indoor  $PM_{2.5}$  air pollution. Adequate air cleaner machine numbers, appropriate airflow, and window ventilation limitations are important to achieve the best efficacy of the HEPA air cleaner.

Keywords: air cleaner; air pollution; HEPA; PM<sub>2.5</sub>

# 1. Introduction

Air pollution is one of the most important global health issues. It has already become the 4th leading risk factor of early death worldwide in 2019, and accounts for 6.67 million deaths from all causes [1,2]. Particulate matter 2.5 ( $PM_{2.5}$ ), defined as small particles of aerodynamic diameter <2.5 µm, represents the major air pollutants in both outdoor and indoor environments. During respiration,  $PM_{2.5}$  can reach deeply into the alveoli and enter the blood circulation, resulting in nearly all kinds of organ system damage by inducing local and systemic inflammation via oxidative stress, immune and inflammation dysregulation, and altered gene expression [3,4]. The current literature has shown a clear association between  $PM_{2.5}$  exposure and the development of lung cancer, chronic obstructive pulmonary disease (COPD), lung function decline, asthma, and pneumonia [5–9]. Besides,  $PM_{2.5}$  also contributes to ischemic heart disease and cerebrovascular disease [10].

The global mean  $PM_{2.5}$  in 2019 was 43 µg/m<sup>3</sup> [1,2]. The highest mean  $PM_{2.5}$  level has been reported in East and South Asia (India 83.2 µg/m<sup>3</sup>, Nepal 83.1 µg/m<sup>3</sup>), the Middle East (Saudi Arabia 62 µg/m<sup>3</sup>), and Africa (Egypt 67.9 µg/m<sup>3</sup>), whereas the lowest  $PM_{2.5}$  level was in the United States (7.7 µg/m<sup>3</sup>), United Kingdom (10 µg/m<sup>3</sup>), Canada (7.1 µg/m<sup>3</sup>), and Australia (6.7 µg/m<sup>3</sup>) [2]. In Taiwan, the mean  $PM_{2.5}$  data was 23 µg/m<sup>3</sup> [2]. The  $PM_{2.5}$  data also varies among different seasons in Taiwan, with the highest reported during winter and the lowest during summer [11,12]. In Kaohsiung, a city in Southern Taiwan, the average  $PM_{2.5}$  data may reach up to 50 µg/m<sup>3</sup> during the winter seasons [11,12]. Although



Citation: Chen, C.-F.; Hsu, C.-H.; Chang, Y.-J.; Lee, C.-H.; Lee, D.L. Efficacy of HEPA Air Cleaner on Improving Indoor Particulate Matter 2.5 Concentration. *Int. J. Environ. Res. Public Health* **2022**, *19*, 11517. https://doi.org/10.3390/ ijerph191811517

Academic Editor: Krassi Rumchev

Received: 22 July 2022 Accepted: 12 September 2022 Published: 13 September 2022

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**Copyright:** © 2022 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). the yearly mean  $PM_{2.5}$  level has gradually improved over the past 15 years in Taiwan, air pollution caused by  $PM_{2.5}$  is still severe in middle and southern Taiwan [12].  $PM_{2.5}$  can easily infiltrate buildings through the windows. Literature has shown that people spend an average of 87% of their time indoors [13]. Therefore, indoor air quality control is an important and effective method to reduce  $PM_{2.5}$  exposure.

The high-efficiency particulate air (HEPA) filter is a type of fibrous media air filter that effectively removes  $\geq 99.97\%$  of 0.3-µm fine particles from the air [14]. Theoretically, a portable HEPA filter is an ideal and effective method to reduce the indoor PM<sub>2.5</sub> level and improve air quality. However, previous studies have demonstrated variable efficacy of portable HEPA air cleaners on reducing indoor PM<sub>2.5</sub> (29–66%) [15–20]. This considerable variation is a warning that HEPA air cleaner efficacy could be severely impaired by certain factors. It has been reported that higher window opening frequency is associated with worse air cleaner efficacy [15,20]. Air cleaner use time (in other words: compliance) is also an obvious problem affecting air cleaner efficacy [20]. Air cleaner use pattern and HEPA filter condition (new vs. old) are other factors that require further study [15,18]. Therefore, in this study, we aim to evaluate the real-world efficacy of portable HEPA air cleaners and to analyze its association with the possible factors.

#### 2. Materials and Methods

In this study, portable HEPA air cleaners (F-VXH50W, Panasonic, Japan) are tested and laser light dispersion PM sensors are used to continuously monitor PM<sub>2.5</sub> level. This study was conducted in a single indoor space in Kaohsiung City, Taiwan, from October 2020 to April 2021. A graphic of the air cleaner study is shown in Figure 1. Six groups of air cleaner experiments were designed according to different machine numbers (1, 2 or 3) and airflow setting (low flow and medium flow) (Figure 1). In each group, the experiments were performed over 3 separate days (24 h each time, total 72 h). The indoor and outdoor  $PM_{2.5}$  levels were measured continuously, starting from 6:30 a.m. to 6:30 a.m. the next day. In the first 12 h (6:30 a.m.–6:30 p.m.), the air cleaner was turned off (Control group). In the following 12 h (6:30 p.m.–6:30 a.m. of the next day), the air cleaner was turned on to evaluate its efficacy on indoor  $PM_{2.5}$  level (Intervention group).





The  $PM_{2.5}$  level was measured using an AirBox (AI-1001W V2 and AI-1001W V3, Edimax, Taipei, Taiwan) that is equipped with Plantower PMS5003, laser light dispersion technique-based PM sensor. The AirBox continuously measures the  $PM_{2.5}$  levels at 6-min

interval. The accuracy of this PM<sub>2.5</sub> sensor has been validated previously and showed good correlation (regression coefficient R = 0.82–0.99) compared with professional PM monitors [21–23]. A correlation test was performed to confirm the reliability and accordance of the two PM<sub>2.5</sub> sensors used in our study and showed a very good correlation (R = 0.99,  $R^2 = 0.98$ , Figure S2).

The study environment was an apartment in Kaohsiung City, Taiwan, with an indoor area of 63.9 m<sup>2</sup> and a height of 280 cm. The floor plan of the apartment shows the positions of two AirBox PM<sub>2.5</sub> sensors and three air cleaners (Figure S3). The AirBox was implanted in the middle of the apartment to measure the indoor PM<sub>2.5</sub> level, and another AirBox was implanted on the balcony to measure the outdoor PM<sub>2.5</sub> level. A window-open protocol was developed to standardize the window ventilation condition during the study. Window ventilation period: the large window of the living room (102 × 192 cm) was only opened 30 min twice a day (6:30–7:00 a.m., and then at night after 6:30 p.m.). The small windows of the kitchen ( $60 \times 57$  cm) and two bathrooms ( $25 \times 43$  cm,  $25 \times 80$  cm), which are located on the same side of the apartment, were kept open all day to maintain minimal ventilation. Serial CO<sub>2</sub> was measured using a portable CO<sub>2</sub> monitor (GC-2028, Lutron Electronics Inc., Coopersburg, PA, USA) to evaluate the safety and effectiveness of this window-open protocol (Figure S1). The results show marginal CO<sub>2</sub> elevation at the end of the test (mean 1014 ppm, range: 841–1208 ppm), slightly above the recommended upper normal limit for indoor CO<sub>2</sub> (1000 ppm) [24].

The indoor PM<sub>2.5</sub>, outdoor PM<sub>2.5</sub>, and indoor/outdoor PM<sub>2.5</sub> percentage were collected. The outdoor wind speed data was collected from the Environmental Protection Administration of Taiwan. The features of the air cleaner were also evaluated, including the airflow speed, noise, air outlet size, and size of the HEPA filter. The airflow speed was measured in the middle of the airflow outlet using a portable airflow meter (LM-81 AM, Lutron Electronics Inc., Coopersburg, PA, USA). The air cleaner noise was measured at a distance of 1 m from the airflow outlet using a portable noise meter (TM-102, TENMARS Electronics Co. Ltd., Taipei, Taiwan). Air filtration volume was calculated to estimate the clean air delivery rate (CADR) at each airflow speed setting.

The primary outcome is indoor/outdoor  $PM_{2.5}$  percentage. The secondary outcomes are indoor and outdoor  $PM_{2.5}$  level, mean change in indoor  $PM_{2.5}$ , and mean change in indoor/outdoor  $PM_{2.5}$  percentage after air cleaner filtration. Factors associated with indoor  $PM_{2.5}$  and indoor/outdoor  $PM_{2.5}$  percentages are also secondary outcomes.

Continuous variables are expressed as mean  $\pm$  standard deviation. Independent *t*-tests were used for two-group comparison, whereas one-way analysis of variance (ANOVA) was used for multiple-group comparisons. Categorical variables are expressed as numbers (percentage) and were compared using the chi-square test or Fisher's exact test if the expected count in any cell was < 5. Multiple linear regression was used to analyze the factors associated with PM<sub>2.5</sub> outcomes. Statistical analysis was performed using IBM SPSS Statistics for Windows, Version 20.0 (IBM Corp., Armonk, NY, USA). The differences were considered significant at a two-tailed *p*-value of < 0.05.

#### 3. Results

The features of HEPA air cleaners tested in this study are shown in Table 1. The airflow speed and estimated CADR of the medium-flow setting are approximately three-fold of the low-flow setting. The three-fold flow difference is also observed between the medium-flow and the high-flow setting. The high-flow setting showed much louder noise production, which is intolerable when continuously used. The HEPA filter size was  $40.5 \times 24.5 \times 3.5$  cm. During the initial 12 h period of experiment when the air cleaner was s turned off, the indoor and outdoor PM<sub>2.5</sub> levels were highly correlated. The average indoor/outdoor PM<sub>2.5</sub> ratio is 0.76 ± 0.17, and the linear regression shows R = 0.794.

Air Cleaner Setting	n	Airflow Speed (m/s)	Outlet Area (cm <sup>2</sup> )	Estimated CADR (m <sup>3</sup> /h)	Noise (dB)
Low flow	9	$0.53\pm0.11$	207	39.5	$31.4\pm1.5$
Medium flow	9	$1.47\pm0.1$	207	109.5	$35.9\pm0.6$
High flow	9	$4.34\pm0.11$	207	323.4	$56.5\pm1.6$

Table 1. Features of HEPA filter air cleaners tested in this study.

CADR = clean air delivery rate, HEPA = High-efficiency particulate air.

The overall indoor and outdoor PM<sub>2.5</sub> levels before and after air cleaner filtration are shown in Figure 2 and Table 2. Significant improvement is observed in the indoor PM<sub>2.5</sub> level (33.5 ± 10.3 vs. 17.2 ± 10.7 µg/m<sup>3</sup>, mean difference (MD) =  $-16.3 µg/m^3$ , p < 0.001) and indoor/outdoor PM<sub>2.5</sub> percentage (76.3 ± 16.8 vs. 38.6 ± 19.8%, MD = -37.7%, p < 0.001) after the start of HEPA air cleaners. By contrast, no significant change is observed in the outdoor PM<sub>2.5</sub> level (44.7 ± 13.8 vs. 44.6 ± 16.8, MD =  $-0.1 µg/m^3$ , p = 0.875). The detailed PM<sub>2.5</sub> data of each study group are shown in Table 2, Figures 3, 4 and S4. All six groups of HEPA air cleaners show significant improvement in indoor PM<sub>2.5</sub> level after air cleaner use (MD range: -3.7 to  $-26.5 µg/m^3$ ) and indoor/outdoor PM<sub>2.5</sub> percentage (MD range: -10.4% to -56.4%). The detailed trends of indoor/outdoor PM<sub>2.5</sub> percentage in the six study groups are shown in Figure S5. The distributions of outdoor wind speed in each study group are shown in Figure S6, and a one-way ANOVA shows a significant difference between the groups (p < 0.001).



**Figure 2.** Overall changes in indoor and outdoor  $PM_{2.5}$  levels before and after air cleaner use: (**A**) outdoor  $PM_{2.5}$ ; (**B**) indoor  $PM_{2.5}$ ; and (**C**) indoor/outdoor  $PM_{2.5}$  percentage. \* outliers.

The influence of living room window ventilation on the efficacy of the air cleaner is shown in Figure 5 and Table 3. Overall, indoor/outdoor  $PM_{2.5}$  percentage is significantly higher during the window open period than that during the window close period (65.3  $\pm$  21.5 vs. 37.5  $\pm$  18.9%, MD = 27.8%, *p* < 0.001). A significant difference is found in all six groups (MD: 22.1% to 37.5%). During the window ventilation period, the mean indoor/outdoor PM<sub>2.5</sub> percentage is >60% in five of six groups (except for the three machines with medium-flow setting group: 47.4  $\pm$  15.7%). This finding implies that the efficacy of portable HEPA air cleaner is severely impaired during the period of living room window ventilation.

Group	Flow (n)	Outdoor PM <sub>2.5</sub> µg/m <sup>3</sup>	MD	Indoor PM <sub>2.5</sub> μg/m <sup>3</sup>	MD	p Value	Indoor /Outdoor PM <sub>2.5</sub> %	MD	p Value
	Off (350)	$44.8\pm10.2$	2.6	$32.6\pm10.9$	-3.7	< 0.001	$72.2\pm19$	-10.4	< 0.001
1 air cleaner low flow	On (349)	$47.4 \pm 19.3$		$28.9 \pm 11.4$			$61.8 \pm 16.7$		
	Off (347)	$56.7 \pm 15.9$	-3.4	$44.7\pm8.2$	-23.9	< 0.001	$82.2 \pm 17$	-40.5	< 0.001
1 air cleaner medium flow	On (344)	$53.3 \pm 19.6$		$20.8\pm7.8$			$41.7\pm17.6$		
2 air cleaner low flow	Off (348)	$47.9 \pm 15.1$	0.4	$35.7 \pm 9.1$	-15.4	< 0.001	$78.1\pm21.1$	-37.5	< 0.001
	On (350)	$48.3\pm24.2$		$20.3\pm11.9$			$40.6\pm13.8$		
2	Off (349)	$40.5\pm 6.3$	0	$25.6\pm4.6$	-13.9	< 0.001	$63.6\pm9.2$	-35.2	< 0.001
2 air cleaner medium flow	On (348)	$40.5\pm4.8$		$11.7\pm6.9$			$28.4 \pm 15.3$		
3 air cleaner low flow	Off (350)	$31.7\pm5.1$	1.1	$26 \pm 3$	-14.2	< 0.001	$83.3\pm11.4$	-46.1	< 0.001
	On (351)	$32.8\pm5.3$		$11.8 \pm 4$			$37.2\pm16.3$		
3 air cleaner medium flow	Off (351)	$46.7\pm12.3$	-1.1	$36.2\pm9$	-26.5	< 0.001	$78.5 \pm 11.3$	-56.4	< 0.001
	On (349)	$45.6\pm7.7$		$9.7\pm4.1$			$22.1\pm12$		
Overall	Off (2095)	$44.7 \pm 13.8$	-0.1	$33.5\pm10.3$	-16.3	< 0.001	$76.3 \pm 16.8$	-37.7	< 0.001
	On (2091)	$44.6\pm16.8$		$17.2\pm10.7$			$38.6\pm19.8$		

Table 2. Summary of outdoor and indoor PM<sub>2.5</sub> outcomes.

MD = mean difference.



**Figure 3.** Details of the changes in indoor/outdoor PM<sub>2.5</sub> percentage of each study group before and after air cleaner use. Remarkable improvements of indoor/outdoor PM<sub>2.5</sub> percentage are noted after air cleaner use, except for the 1 machine low flow group. \* outliers.

Multiple linear regressions were performed to evaluate the factors associated with indoor PM<sub>2.5</sub> levels (Table 4) and indoor/outdoor PM<sub>2.5</sub> percentage (Table 5). Air cleaner setting (higher airflow speed and machine number), window ventilation, and outdoor PM<sub>2.5</sub> are significant factors affecting indoor PM<sub>2.5</sub> and indoor/outdoor PM<sub>2.5</sub> percentage. For indoor PM<sub>2.5</sub>: R = 0.879 and R square ( $R^2$ ) = 0.773; and for indoor/outdoor PM<sub>2.5</sub> percentage: R = 0.808 and  $R^2 = 0.653$ . The outdoor wind speed, however, did not significantly affect indoor PM<sub>2.5</sub> and indoor/outdoor PM<sub>2.5</sub> percentage.



**Figure 4.** Box plots of PM<sub>2.5</sub> outcomes in the six groups: (**A**) indoor/outdoor PM<sub>2.5</sub> percentage and (**B**) indoor PM<sub>2.5</sub> levels. More air cleaner machines and higher flow speeds are significantly associated with better indoor PM<sub>2.5</sub> level. \* outliers.



**Figure 5.** Details on the influence of living room window ventilation on the efficacy of air cleaners in each study group. The efficacy of HEPA filter air cleaner is severely impaired during period of window open for ventilation. \* outliers.

Group	Living Room Window	Ν	Indoor/Outdoor PM <sub>2.5</sub> %	MD	p Value
1 air cleaner low flow	close	337	$60.7 \pm 15.9$	30.9	< 0.001
	open	12	$91.6 \pm 10.4$		
1 air cleaner medium flow	close	329	$40.7\pm16.9$	22.7	< 0.001
	open	15	$63.4 \pm 17.9$		
2 air cleaner low flow	close	335	$39.7 \pm 12.5$	22.1	< 0.001
	open	15	$61.8\pm22.5$		
2 air cleaner medium flow	close	333	$26.8 \pm 13.2$	37.5	< 0.001
	open	15	$64.3\pm15$		
3 air cleaner low flow	close	334	$35.7 \pm 14.3$	32.3	< 0.001
	open	17	$68\pm22.2$		
3 air cleaner medium flow	close	334	$21\pm10.5$	26.4	< 0.001
	open	15	$47.4 \pm 15.7$		
Overall	close	2002	$37.5 \pm 18.9$	27.8	< 0.001
	open	89	$65.3\pm21.5$		

Table 3. PM<sub>2.5</sub> outcomes for living room window ventilation during air cleaner operation.

MD = mean difference.

Table 4. Multiple linear regression analysis of the factors associated with indoor  $PM_{2.5}$ .

В	Standard Error	Beta	R <sup>2</sup> Change	p Value
12.651	0.510			< 0.001
-5.811	0.383	-0.121	0.014	< 0.001
-16.722	0.409	-0.346	0.067	< 0.001
-14.905	0.381	-0.311	0.081	< 0.001
-19.787	0.376	-0.411	0.089	< 0.001
-16.276	0.417	-0.340	0.077	< 0.001
-24.212	0.389	-0.504	0.132	< 0.001
0.464	0.007	0.537	0.304	< 0.001
6.361	0.471	0.100	0.010	< 0.001
-0.104	0.122	-0.008		0.392
	<b>B</b> 12.651 -5.811 -16.722 -14.905 -19.787 -16.276 -24.212 0.464 6.361 -0.104	$\begin{array}{c c} \textbf{B} & \begin{array}{c} \textbf{Standard} \\ \hline \textbf{Error} \\ \hline 12.651 & 0.510 \\ -5.811 & 0.383 \\ -16.722 & 0.409 \\ -14.905 & 0.381 \\ -19.787 & 0.376 \\ -16.276 & 0.417 \\ -24.212 & 0.389 \\ 0.464 & 0.007 \\ 6.361 & 0.471 \\ -0.104 & 0.122 \\ \end{array}$	$\begin{array}{c c c c c c c c c c c c c c c c c c c $	B  Standard Error  Beta  R <sup>2</sup> Change    12.651  0.510

 $R = 0.879, R^2 = 0.773, adjusted R^2 = 0.773.$ 

Table 5. Multiple linear regression analysis of factors associated with indoor/outdoor PM2.5 percentage.

Factors	В	Standard Error	Beta	R <sup>2</sup> Change	p Value
(Constant)	85.748	1.245			< 0.001
1 machine low flow	-13.941	0.934	-0.147	0.022	< 0.001
1 machine medium flow	-33.074	0.996	-0.347	0.110	< 0.001
2 machines low flow	-35.025	0.929	-0.370	0.094	< 0.001
2 machines medium flow	-48.803	0.916	-0.515	0.138	< 0.001
3 machines low flow	-41.898	1.016	-0.444	0.096	< 0.001
3 machines medium flow	-54.154	0.948	-0.572	0.165	< 0.001
Outdoor PM <sub>2.5</sub>	-0.210	0.017	-0.123	0.015	< 0.001
Window ventilation	14.087	1.149	0.113	0.013	< 0.001
Outdoor wind speed	-0.332	0.296	-0.013		0.263

R = 0.808,  $R^2 = 0.653$ , adjusted  $R^2 = 0.652$ .

# 4. Discussion

This study showed that HEPA air cleaners can effectively reduce the indoor  $PM_{2.5}$  level and achieve good indoor air quality. Under the best air cleaner setting (three machines with medium-airflow setting), the HEPA air cleaner can achieve an indoor  $PM_{2.5}$  level of 9.7 µg/m<sup>3</sup>, an indoor/outdoor  $PM_{2.5}$  percentage of 22.1%, and  $PM_{2.5}$  improvement of up to 56%. However, the efficacy of the HEPA air cleaner is variable due to the different settings of the air cleaner and the environment. Airflow speed, machine number, outdoor  $PM_{2.5}$  level, and window ventilation are significant factors affecting indoor  $PM_{2.5}$ .

There are approximately three-fold differences observed between air cleaners with medium-flow and low-flow settings. According to the coefficient and R square change of each variable in the multiple linear regression model (Tables 4 and 5), the effect size of 1 machine with medium flow is similar to 2 machines with low flow. The effect size is larger in 2 machines with medium flow than 3 machines with low flow. These findings suggest that the more machines are not always better. Airflow speed, in addition to the machine number, is also an important factor affecting the PM<sub>2.5</sub> outcomes and HEPA air cleaner efficacy.

The indoor  $PM_{2.5}$  level is closely affected by outdoor  $PM_{2.5}$ , via window ventilation. Previous literature shows good correlations between indoor and outdoor  $PM_{2.5}$  (linear regression R = 0.66–0.91) in buildings without air cleaners [25,26], and the average indoor/outdoor ratio ranged from 0.69 to 0.94 [25], which corresponds with the result of our study (when air cleaners are turned off, the average indoor/outdoor ratio = 0.76, linear regression R = 0.794).

Our study clearly shows that window ventilation severely reduces the efficacy of HEPA air cleaners. In Figure S5 (Supplementary Materials), which shows the detail 24-h trends of indoor/outdoor  $PM_{2.5}$  percentage in the six study groups, rapid declines in indoor/outdoor  $PM_{2.5}$  percentage are observed right after air cleaners turn on at 18:30. However, recurrent high peaks of indoor/outdoor  $PM_{2.5}$  percentage are frequently found between 20:00–21:00, which correlates with the time of window ventilation. This implies that during the period of window ventilation, the air volume through the window is large enough to overwhelm the filtration capacity of air cleaners. Therefore, the appropriate limitation of window opening for ventilation is crucial to ensure the efficacy of the HEPA air cleaner. However, window closure would induce an elevation of the indoor  $CO_2$  level. Our window opening protocol provides an example of the minimal ventilation required to maintain the indoor  $CO_2$  near upper normal limit.

The current PM<sub>2.5</sub> air pollution status in Taiwan is better than that in South Asia, North Africa, and the Middle East, but still above the normal range of the air quality index of the United States (AQI, 0–12  $\mu$ g/m<sup>3</sup>) [27]. Furthermore, the 2021 World Health Organization air quality guideline suggests an annual mean PM<sub>2.5</sub> level of 5  $\mu$ g/m<sup>3</sup>, because in recent years, it has been considered that there is no actually safe threshold for PM<sub>2.5</sub>, and therefore people should keep PM<sub>2.5</sub> concentration as low as possible [28,29]. Our study demonstrates a good example that under the ideal window ventilation condition, adequate machine number, and airflow, the best efficacy of portable HEPA air cleaners can achieve an indoor PM<sub>2.5</sub> level within the normal AQI range (outdoor 45.6  $\mu$ g/m<sup>3</sup> vs. indoor 9.7  $\mu$ g/m<sup>3</sup>, in 3 air cleaner medium flow group) during the air pollution seasons in Southern Taiwan.

Our study has several limitations. First, it was conducted in a single indoor space. Therefore, our study results may not represent the efficacy of HEPA air cleaners in different environments. Second, the window opening protocol cannot be directly applied to buildings with different indoor areas. However, the monitoring of indoor  $CO_2$  level is an alternative guide for maintaining minimal required ventilation. Third, we did not evaluate the auto-mode of the air cleaner. Although auto-mode is commonly used in real-life, it is difficult to evaluate the relation between airflow speed and air cleaner efficacy.

## 5. Conclusions

This study shows the effectiveness of the portable HEPA air cleaner on improving indoor  $PM_{2.5}$  level. However, the efficacy of the air cleaner is also easily affected by several factors. It has been demonstrated that by controlling these factors: adequate machine number, continuous higher airflow (with acceptable noise), and appropriate limitation of window ventilation by using a simple protocol, HEPA air cleaner can significantly reduce the indoor  $PM_{2.5}$  to below 10 µg/m<sup>3</sup>. People spend most of their time in indoor environments. Significantly reducing chronic indoor  $PM_{2.5}$  exposure by HEPA air cleaners should be an effective method to improve general health. Future air cleaner studies

about machine positions, different window ventilation methods, and different HEPA filter conditions are required for further guidance of air cleaner use.

**Supplementary Materials:** The following supporting information can be downloaded at: https: //www.mdpi.com/article/10.3390/ijerph191811517/s1, Figure S1. Window ventilation protocol and indoor CO<sub>2</sub> trend. Figure S2. Correlation of the 2 AirBox PM<sub>2.5</sub> sensors. Figure S3. Floor plan of the study apartment. Figure S4. Details of the changes in (A) outdoor and (B) indoor PM<sub>2.5</sub> levels of each study group before and after air cleaner use. Figure S5. Detail trends of indoor/outdoor PM<sub>2.5</sub> percentage in the six study groups. Figure S6. Box plots of outdoor wind speed distributions in each study groups.

Author Contributions: Conceptualization, C.-F.C., Y.-J.C. and C.-H.H.; methodology, C.-F.C., Y.-J.C.; validation, C.-F.C., C.-H.H., C.-H.L. and D.L.L.; formal analysis, C.-F.C., Y.-J.C. and C.-H.L.; investigation, C.-F.C., C.-H.H., Y.-J.C. and D.L.L.; resources, C.-F.C. and D.L.L.; data curation, C.-F.C. and Y.-J.C.; writing—original draft preparation, C.-F.C.; writing—review and editing, C.-F.C., C.-H.H., Y.-J.C., c.-H.L. and D.L.L.; visualization, C.-F.C.; supervision, C.-F.C. and D.L.L.; project administration, C.-F.C., C.-H.H. and D.L.L.; funding acquisition, C.-F.C. All authors have read and agreed to the published version of the manuscript.

Funding: This study was supported by Kaohsiung Veterans General Hospital (Grant No.: KSVGH111-052).

Institutional Review Board Statement: Not applicable.

Informed Consent Statement: Not applicable.

Data Availability Statement: Data are contained within the article or Supplementary Materials.

**Acknowledgments:** The authors would like to thank the Department of Medical Education and Research Center of Medical Informatics in Kaohsiung Veterans General Hospital for providing assistance in performing the statistical analyses.

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

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