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Short-term exposure to ambient fine particulate matter constituents and myocardial infarction mortality

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HIGHLIGHTS GRAPHICAL ABSTRACT

- A time-stratified case-crossover study was conducted to explore the associations.
- A high-quality dataset on fine particulate matter $(PM_{2.5})$ constituents was applied.
- Black carbon and sulfate in $PM_{2.5}$ were linked to myocardial infarction (MI) death.
- \bullet Black carbon and sulfate in $\text{PM}_{2.5}$ led to extensive excess mortality from MI.
- Older adults were more vulnerable to PM2.5 constituent exposures in MI death.

Myocardial infarction PM_{2.5} constituent mortal **Black carbon** Organic carbon Short-term exposure Sulfate Nitrate Ammonium Chloride t change in odds of MI mortality, % • Single-pollutant model A PM2.5-adjusted model Constituent-residual model J ł ŦĮ Î \circ 1 ٦ igo-Black carbon Chloride Organic carbon Sulfate Ammonium Nitrate PM_{2.5} constitue

 $^{\rm 1}$ These authors contributed equally to this work.

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Short-term ambient fine particulate matter ($PM_{2.5}$) exposure has been related to an increased risk of myocardial infarction (MI) death, but which $PM_{2.5}$ constituents are associated with MI death and to what extent remain unclear. We aimed to explore the associations of short-term exposure to PM2.5 constituents with MI death and evaluate excess mortality. We conducted a time-stratified case-crossover study on 237,492 MI decedents in Jiangsu province, China during 2015–2021. Utilizing a validated PM2.5 constituents grid dataset at 1 km spatial resolution, we estimated black carbon (BC), organic carbon (OC), sulfate (SO $_4^{2-}$), nitrate (NO₃), ammonium (NH4 ⁺), and chloride (Cl[−]) exposure by extracting daily concentrations grounding on the home address of each subject. We employed conditional logistic regression models to evaluate the exposure-response relationship between PM2.5 constituents and MI death. Overall, per interquartile range (IQR) increase of BC (lag 06-day; IQR: 1.75 μg/m³) and SO²⁻ (lag 04-day; IQR: 5.06 μg/m³) exposures were significantly associated with a 3.91% and 2.94% increase in odds of MI death, respectively, and no significant departure from linearity was identified in the exposure-response curves for BC and SO_4^{2-} . If BC and SO_4^{2-} exposures were reduced to theoretical minimal risk exposure concentration (0.89 μg/m³ and 1.51 μg/m³), an estimate of 4.55% and 4.80% MI deaths would be avoided, respectively. We did not find robust associations of OC, NO₃, NH₄, and Cl[−] exposures with MI death. Individuals aged ≥80 years were more vulnerable to PM2.5 constituent exposures in MI death (*p* for difference <0.05). In conclusion, short-term exposure to PM_{2.5}-bound BC and SO²⁻ was significantly associated with increased odds of MI death and resulted in extensive excess mortality, notably in older adults. Our findings emphasized the necessity of reducing toxic PM_{2.5} constituent exposures to prevent deaths from MI and warranted further studies on the relative contribution of specific constituents.

1. Introduction

As a great public health threat, ischemic heart disease (IHD) appeared as a steadily upward trend for global mortality during the past 3 decades and contributed to approximately 9.14 million deaths worldwide in 2019, which was projected to be more serious in the future (Roth et al., [2020\)](#page-7-0). Myocardial infarction (MI), the major clinical manifestation of IHD, continues to be a health challenge because of its characteristics of acute attack and high fatality rate ([Thygesen](#page-7-0) et al., [2007\)](#page-7-0). Given the huge MI death number, clarifying and managing its modifiable risk factors is a significant and effective way to reduce MI deaths and alleviate its disease burden. Fine particulate matter $(PM_{2.5})$ pollution in the atmosphere is considered one of the critical environmental risk factors for MI mortality, which has raised much attention globally (Chen et al., [2018;](#page-7-0) Dai et al., [2014;](#page-7-0) [Liang](#page-7-0) et al., 2018; [Mustafic](#page-7-0) et al., [2012;](#page-7-0) [Rajagopalan](#page-7-0) et al., 2018; Zanobetti and [Schwartz,](#page-8-0) 2009). Our previous studies in Jiangsu province and Hubei province, China offered reliable evidence that short-term exposure to $PM_{2.5}$ was significantly associated with increased odds of MI death (Liu et al., [2021a;](#page-7-0) [Xu](#page-8-0) et al., [2023\)](#page-8-0). Emerging investigations suggest that some toxic constituents in PM2.5, including carbonaceous compound and water-soluble inorganic ion (WSII), may play a pivotal role in PM2.5-induced MI death (Li et al., [2021](#page-7-0); Mo et al., [2023;](#page-7-0) Yang et al., [2020;](#page-8-0) [Zhang](#page-8-0) et al., 2021). Since PM_{2.5} consists of various components with varying origins, toxicities, and health impacts, it is crucial to elucidate which constituents can exert harmful effects on MI mortality and how much the effects are, which can help understand their underlying cardiotoxicity and enact tailored measures to prevent $PM_{2.5}$ -related MI mortality.

To date, only 3 population-based studies explored the acute effect of PM2.5 constituent exposures on MI death, and their findings were mixed (Li et al., [2021;](#page-7-0) Mo et al., [2023](#page-7-0); Yang et al., [2020\)](#page-8-0). One study in southern China found significant associations between organic carbon (OC) and elemental carbon (EC) exposures and MI death; however, a nationwide study in China and a study in Guangzhou, China did not find consistent results. A significant association of ammonium (NH $_{4}^{+}$) exposure with MI death was identified in the nationwide study in China but not identified in the other 2 studies. A major concern in these studies is the limited accuracy of exposure assessment, because the $PM_{2.5}$ constituent exposure was estimated by the average concentration within a large region, which had difficulties in capturing the geographic variability of $PM_{2.5}$ constituents and may further affect the reliability of results. This exposure assessment problem is largely attributable to the deficiency of PM2.5 constituent data with high spatiotemporal resolution.

To provide a more accurate assessment of $PM_{2.5}$ constituent exposures, we generated a daily and seamless PM_{2.5} constituent product at high spatial resolution (1 km \times 1 km) in China in our previous studies, which is a unique grid dataset offering high-precision estimation on PM_{2.5}-bound carbonaceous compounds and WSIIs (Wei et al., [2023a](#page-8-0), [2023b\)](#page-8-0). Here, we took advantage of this dataset to assess short-term exposure to $PM_{2.5}$ constituents at an individual level grounding on subjects' home addresses in Jiangsu province, China. A case-crossover study on over 0.2 million MI death cases was conducted in Jiangsu during 2015–2021 to systematically investigate the acute impact of PM_{2.5} constituent exposures on MI death and evaluate the excess mortality.

2. Methods

2.1. Study population and outcome definition

Located in the eastern-central area of China, Jiangsu province had a population of 85.1 million in 2021, which accounted for 6.0% of the entire population in China. We ascertained 237,492 decedents who resided in Jiangsu province, China and died from MI during 2015–2021 grounding on the Jiangsu provincial mortality surveillance system. This system covered the overall population of Jiangsu and was under the administration of the Chinese Center for Disease Control and Prevention. We gathered information for each death case from this system, including sex, race, age, marital status, date of death, home address, and the underlying cause of death coded by the International Statistical Classification of Diseases and Related Health Problems 10th Revision (ICD-10). The outcome of this study was MI death as the underlying cause of death (ICD-10 code: I21 and I22), including acute MI and subsequent MI. This study has received approval from the Ethical Committee at the School of Public Health, Sun Yat-sen University with an exemption of informed consent.

2.2. Study design

We implemented a time-stratified case-crossover design to assess the impact of short-term exposure to PM_{2.5} constituents on MI death. Under this design, exposure for a specific MI decedent on the case day was compared with exposures on days before and/or after the case day in the same time stratum (control days). The case day for each MI decedent was the date of death, whereas control days matched the case day by year, calendar month (the time stratum), and day of week with a matching ratio of 1 (case day) to 3 or 4 (control days). For instance, if an individual died from MI on a Thursday in August 2020 (case day), all other Thursdays in August 2020 were the matching control days. This design allowed for sufficient control of factors unlikely to vary within a calendar month (e.g., sex, economic condition, living habit) and the impact of seasonality, long-term trends, and day of week.

2.3. Exposure assessment

We retrieved a grid dataset on black carbon (BC), sulfate (SO $^{2-}_{4}$), nitrate (NO $_3^{\!-\!}$), NH $_4^{\!+\!}$, and chlorine (Cl $^-$) bounding to PM $_{2.5}$ in Jiangsu province during 2015–2021, which was generated by a fourdimensional spatiotemporal deep forest (4D-STDF) model that combined surface observations, satellite-derived big data, atmospheric reanalyzes, and model simulations (Wei et al., [2023a](#page-8-0), [2023b\)](#page-8-0). This dataset was available daily at a 1 km \times 1 km spatial resolution, which had full-coverage PM2.5 constituent estimations in China since 2000 and showed great agreement with surface measured values. The cross-validated coefficient of determinations (CV-R²) for BC, SO $^{2-}_{4}$, NO $^{-}_{3},$ NH $_4^+$, and Cl $^-$ were 0.82, 0.74, 0.75, 0.71, and 0.66, respectively. The pairwise Spearman's correlation coefficients of surface observation values with PM_{2.5} constituent estimation values for BC, SO_4^{2-} , NO₃, NH $_4^+$, and Cl $^-$ in Jiangsu province were 0.82, 0.69, 0.71, 0.72, and 0.81, respectively. To generate the grid data for OC, we computed the OC concentration for each grid cell by deducting the concentrations for BC, SO²⁻, NO₃, NH₄⁺, and Cl[−] from that for PM_{2.5} (Li et al., [2024\)](#page-7-0). We also retrieved daily grid data (spatial resolution: $1 \text{ km} \times 1 \text{ km}$) on ambient PM2.5 concentrations during 2015–2021 from the ChinaHighAirPollutant (CHAP) dataset. Grounding on each study subject's home address, daily exposure to PM2.5 and its 6 constituents was assessed by extracting concentrations on both the case day and control days from the corresponding pollutant grid data. Besides examining the impact of PM2.5 constituent exposures on the current day (lag 0-day), exposures on single-day lag (lag 1-day to lag 6-day) and moving mean day (lag 01-day to lag 06-day) were investigated to assess the hysteresis impact of $PM_{2.5}$ constituent on MI mortality (Liu et al., [2022a\)](#page-7-0). For instance, lag 4-day exposure denotes the exposure on 4 days precedent to the case/ control day, whereas lag 04-day exposure denotes the average concentration from the case/control day to its previous 4 days.

2.4. Covariates

From the China Meteorological Administration Land Data Assimilation System (CLDAS version 2.0), we retrieved grid data (spatial resolution: 0.0625◦ × 0.0625◦; temporal resolution: daily) on temperature (unit: ◦C) and relative humidity (unit: %) in Jiangsu, China during the study period (Han et al., [2020](#page-7-0); Liu et al., [2020](#page-7-0); Tie et al., [2022](#page-7-0)). We assessed exposure to weather conditions for each subject by extracting his/her 24-h residential average values of temperature and relative humidity from the corresponding grid data. Personal covariates (e.g., sex, race, age, financial situation, and chronic comorbidities) were not included as confounders as they generally stayed constant within the time stratum (Liu et al., [2021a](#page-7-0)).

2.5. Statistical analysis

Conditional logistic regression models were utilized to evaluate the exposure-response relationship of $PM_{2.5}$ constituent exposures with MI death. We computed the percent change in odds ([odds ratio -1] \times 100%) of MI death and its 95% confidence interval (CI) associated with an interquartile range (IQR) increment of $PM_{2.5}$ constituent exposure. To visualize the exposure-response relationship, we included a natural cubic spline function for each PM2.5 constituent exposure with 3 degrees of freedom in the conditional logistic regression model and tested the underlying nonlinearity utilizing a likelihood ratio test (Li et al., [2023](#page-7-0)). All models included temperature with 6 degrees of freedom (lag 03-day) and relative humidity with 3 degrees of freedom (lag 03-day) for a natural cubic spline function to adjust for weather conditions [\(Liu](#page-7-0) et al., [2019;](#page-7-0) Xu et al., [2022](#page-8-0)).

To assess the excess mortality from MI related to $PM_{2.5}$ constituent exposures, we applied the estimates in the exposure-response associations to compute the excess fraction and number of excess deaths:

$$
Excess fraction = \frac{\sum_{i=1}^{i=N} 1 - \frac{1}{e^{\beta \times (C_i - C_0)}}}{N} \times 100\%
$$

Number of excess deaths = *Excess fraction* \times *N*

where *N* is the MI death number; β is the point estimate of each PM_{2.5} constituent exposure; C_i denotes the $PM_{2.5}$ constituent exposure with concentration exceeding *C*0; *C*⁰ denotes a counterfactual scenario of theoretical minimum risk exposure concentration.

To explore the potentially susceptible population and seasonal variation, we carried out stratified analyses by sex (male vs female), age (*<*80 years vs ≥ 80 years), and season (cool [January to March, October to December] vs warm [April to September]) and implemented 2-sample z tests to assess their effect modification (Fan et al., [2023\)](#page-7-0). Sensitivity analyses were performed, including 1) building $PM_{2.5}$ -adjusted models by controlling $PM_{2.5}$ to estimate the impact of a given $PM_{2.5}$ constituent retaining the concentrations of other constituents stable; 2) constructing constituent-residual models by including the residuals from a linear regression model with $PM_{2.5}$ and its specific constituent as the independent and the dependent variable, respectively, which assessed the effect of the constituent keeping the concentration of $PM_{2.5}$ stable; 3) restricting the analyses to acute MI death cases; 4) adjusting for exposure to temperature utilizing a natural spline function with 3 degrees of freedom; 5) adjusting for exposure to relative humidity using a natural spline function with 6 degrees of freedom; 6) restricting the analyses to subjects who died in 2015–2019 and 2020–2021, respectively, to evaluate the potential effect of the pandemic. A 2-sided test with *p <*0.05 was statistically significant. We implemented all analyses by R version 4.1.2.

3. Results

We ascertained 237,492 MI death cases during the study period and included 237,492 case days and 806,169 control days [\(Table](#page-3-0) 1). Among the MI death cases, 98.50% died from acute MI, 52.25% were men, 52.50% died at or after 80 years of age, and 56.99% died in the cool season. Most study subjects were married (63.15%) or widowed (31.08%). The number of MI death cases was similar in each year during 2015–2021. The PM_{2.5} mass exposure levels ranged from 2.68 μ g/m³ to 286.06 μ g/m³, with an average concentration of 51.87 μ g/m³ ([Table](#page-3-0) 2). The mean exposure concentration to $PM_{2.5}$ -bound BC, OC, SO $_4^{2-}$, NO₃, NH₄, and Cl[−] was 3.04 μg/m³, 16.60 μg/m³, 10.16 μg/m³, 12.30 μg/m³, 7.64 μg/m³, and 2.19 μg/m³, respectively. The average concentration to BC, OC, SO_4^{2-} , NO₃, NH₄, and Cl⁻ in 2015–2019 was 3.14 μ g/m³, 18.80 μg/m³, 10.49 μg/m³, 13.17 μg/m³, 8.07 μg/m³, and 2.31 μg/m³, respectively; the concentrations in 2020–2021 decreased to 2.74 μ g/m³, 10.69 μg/m³, 9.20 μg/m³, 10.01 μg/m³, 6.44 μg/m³, and 1.85 μg/m³, respectively. Exposure to $PM_{2.5}$ was correlated with each $PM_{2.5}$ constituent exposure significantly and positively (Table S1). The pairwise Spearman's correlation coefficients of $PM_{2.5}$ with BC, OC, SO $_4^{2-}$, NO₃, NH⁺₄, and Cl[−] were 0.91, 0.96, 0.87, 0.93, 0.94, and 0.87, respectively (all $p < 0.05$).

In single-pollutant models, we identified significant associations of short-term $PM_{2.5}$ constituent exposures with MI death, and the strongest associations for BC, OC, SO_4^{2-} , NO₃, NH₄, and Cl[−] exposure pronounced at lag 06-day, lag 06-day, lag 04-day, lag 06-day, lag 06-day, and lag 05 day exposure, respectively ([Fig.](#page-4-0) 1). Per IQR increment of exposure to BC (lag 06-day; IQR: 1.75 μ g/m³), OC (lag 06-day; IQR: 18.55 μ g/m³), SO₄ (lag 04-day; IQR: 5.06 μg/m³), NO₃ (lag 06-day; IQR: 8.30 μg/m³), NH₄

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Table 1

Characteristics of the study subjects in Jiangsu province, China, 2015–2021.

Characteristic	Value
MI deaths, n	237,492
Acute MI, n (%)	233,921 (98.50)
Subsequent MI, n (%)	3571 (1.50)
Case days, n	237,492
Control days, n	806,169
Sex, n (%)	
Male	124,099 (52.25)
Female	113,393 (47.75)
Age	
Mean (SD), year	77.59 (13.32)
Median (IQR), year	80.70 (16.60)
$<$ 80 years, n $(\%)$	112,809 (47.50)
\geq 80 years, n (%)	124,683 (52.50)
Race, Han, n (%)	232,258 (97.80)
Marital status, n (%)	
Married	149,971 (63.15)
Widowed	73,819 (31.08)
Unmarried	5852 (2.46)
Divorced	2034 (0.86)
Unknown	5816 (2.45)
Season at death, n (%)	
Cool (January to March, October to December)	135,339 (56.99)
Warm (April to September)	102,153 (43.01)
Year of death, n (%)	
2015	33,000 (13.90)
2016	34,471 (14.51)
2017	34,696 (14.61)
2018	34,500 (14.53)
2019	32,528 (13.70)
2020	34,447 (14.50)
2021	33,850 (14.25)

Abbreviations: MI, myocardial infarction; ICD-10, International Classification of Diseases 10th Revision; SD, standardized deviation; IQR, interquartile range.

Table 2

Distribution of exposure to ambient PM2.5 constituents and weather conditions on the date of MI death in Jiangsu province, China, 2015–2021.

Abbreviations: $PM_{2.5}$, fine particulate matter; MI, myocardial infarction; SD, standardized deviation; BC, black carbon; OC, organic carbon; SO_4^{2-} , sulfate; NO₃, nitrate; NH[⊥], ammonium; Cl[−], chloride.

(lag 06-day; IQR: 4.34 μ g/m³), and Cl[−] (lag 05-day; IQR: 1.66 μ g/m³) was significantly associated with increased odds of 3.91% (95% CI: 2.66%, 5.17%), 3.66% (95% CI: 2.27%, 5.07%), 2.94% (95% CI: 2.02%, 3.86%), 3.00% (95% CI: 1.77%, 4.25%), 3.89% (95% CI: 2.60%, 5.21%), and 4.60% (95% CI: 3.22%, 5.99%) for MI mortality, respectively (all $p < 0.05$). We did not identify any departure from linearity for

BC, OC, SO_4^{2-} , NO₃, NH₄, and Cl⁻ exposure (*p* for nonlinear trend = 0.21, 0.15, 0.62, 0.55, 0.46, and 0.72, respectively; [Fig.](#page-4-0) 2). In $PM_{2.5}$ adjusted models, the associations for BC, OC, SO_4^{2-} , NH₄, and Cl exposure kept stable (all *p* for difference *>*0.05), but the association between NO₃ exposure and MI mortality turned to null (*p* for difference *<*0.05; [Table](#page-5-0) 3). In constituent-residual models, the associations of each constituent exposure with MI death were significantly changed (all *p* for difference <0.05), and only the associations for BC and SO^{2−} exposure remained significant. Restricting analyses to acute MI, controlling temperature by 3 degrees of freedom, and controlling relative humidity by 6 degrees of freedom yielded similar results (Figs. S1–S3). When restricting analyses to 2015–2019 and 2020–2021, respectively, we found exposure to $PM_{2.5}$ constituents was significantly associated with increased odds of MI death in both periods, but the estimates in 2020–2021 were relatively low (Figs. S4–S7).

In the stratified analyses, stronger associations of exposure to BC, OC, SO_4^{2-} , NO₃, NH₄⁺, and Cl[−] with MI mortality were observed in subjects aged 80 years or older (all *p* for difference *<*0.05; [Table](#page-5-0) 4). We also found a significantly stronger association of OC exposure with MI death in the warm season. No significant effect modification was identified in sex (all *p* for difference *>*0.05).

The excess fraction of MI death associated with BC and SO_4^{2-} exposure was 4.55% (95% CI: 3.15%, 5.92%) and 4.80% (95% CI: 3.34%, 6.22%), respectively [\(Fig.](#page-6-0) 3). If exposure to BC and SO_4^{2-} was reduced to theoretical minimal risk exposure concentration (0.89 μ g/m³ and 1.51 μg/m 3), an estimate of 10,808 (95% CI: 7482, 14,070) and 11,389 (95% CI: 7943, 14,774) MI deaths would be avoided, respectively. The excess fraction of MI death associated with exposure to BC was relatively higher in women, subjects aged 80 years or older, and cool season, accounting for 5.85% (95% CI: 3.85%, 7.80%), 6.51% (95% CI: 4.61%, 8.35%), and 5.11% (95% CI: 3.23%, 6.95%), respectively. The excess fraction associated with SO_4^{2-} exposure was relatively higher in women, subjects aged 80 years or older, and warm season, accounting for 5.39% (95% CI: 3.29%, 7.44%), 6.47% (95% CI: 4.50%, 8.39%), and 4.41% (95% CI: 1.74%, 7.01%), respectively.

4. Discussion

In this study on 237,492 MI death cases in Jiangsu province, China during 2015–2021, we identified that short-term exposure to BC and SO_4^{2-} bounding to PM_{2.5} was consistently associated with increased odds of MI death. Per IQR increase in BC and SO_4^{2-} exposure was significantly associated with a 3.91% and 2.94% increase in odds of MI death, respectively. It was estimated that 4.55% and 4.80% of MI mortality was attributable to BC and SO_4^{2-} exposures, respectively. Individuals aged \geq 80 years were more susceptible to PM_{2.5} constituent exposure in MI mortality. We did not find robust relationships of $PM_{2.5}$ -bound OC, NO₃, NH $_4^+$, and Cl[−] exposure with MI death.

We comprehensively explored the acute impact of ambient $PM_{2.5}$ constituents on MI death grounding on an individual-level $PM_{2.5}$ constituent exposure estimation in this study, taking advantage of a highprecision PM2.5 constituent grid dataset. Previous investigations on the exposure-response relationship of short-term exposure to PM2.5 constituents with MI mortality failed to assess individual-level exposure and yielded inconsistent results. A nationwide study in 161 communities in China did not identify significant associations of EC, SO_4^{2-} , and NO₃ exposures on MI mortality and found that each IQR increase of OC (lag 03-day; IQR: 5.1 μg/m³) and NH₄ (lag 03-day; IQR: 6.8 μg/m³) exposure was significantly associated with increments in MI death of 1.94% and 1.33%, respectively (Yang et al., [2020\)](#page-8-0). Compared to our estimates in single-pollutant models, the estimates for OC between studies were very close, while the estimate for NH $_4^+$ in our study was relatively higher. One study in 32 counties of southern China observed that an IQR increase of EC (lag 02-day; IQR: 4.1 μ g/m³) and OC (lag 02-day; IQR: 9.1 μ g/m³) exposure was significantly associated with increased odds of 3.8% and 5.7% for MI mortality, respectively, but they did not detect significant

Fig. 1. Estimated percent change (95% CI) in odds of MI mortality associated with per IQR increase of exposure to PM_{2.5} constituents with different lag periods. CI, confidence interval. Other abbreviations are in [Tables](#page-3-0) 1 and 2. The IQR of BC, OC, SO $^{2-}_{4}$, NO $^{-}_{3}$, NH $^{+}_{4}$, and Cl $^{-}$ is 1.75 μg/m 3 , 18.55 μg/m 3 , 5.06 μg/m 3 , 8.30 μg/m 3 4.34 μ g/m³, and 1.66 μ g/m³, respectively.

Fig. 2. Exposure-response associations of exposure to PM_{2.5}-bound BC (lag 06-day), OC (lag 06-day), SO $_4^{\rm 7}$ (lag 04-day), NO $_3^{\rm 7}$ (lag 06-day), NH $_4^+$ (lag 06-day), and Cl (lag 05-day) with MI mortality.

CI, confidence interval. Other abbreviations are in [Tables](#page-3-0) 1 and 2. The blue solid lines with shaded areas denote the percent change in odds of MI mortality and its corresponding 95% CI. All *p* for nonlinear trend were *>*0.05. (For interpretation of the references to colour in this figure legend, the reader is referred to the Web version of this article.)

associations for exposure to SO $^{2-}_{4},$ NO $^{-}_{3},$ and NH $^{+}_{4}$ on MI mortality [\(Mo](#page-7-0) et al., [2023](#page-7-0)). The estimate for EC in this study was relatively lower than our estimate for BC in the single-pollutant model, while the estimate for

OC was relatively higher than our estimate. A time-series study in Guangzhou, China identified no significant associations of lag 03-day exposure to EC, OC, and $NO₃⁻$ with MI death (Li et al., [2021\)](#page-7-0). In these

Table 3

Estimated percent change in odds of MI mortality associated with short-term exposure to PM_{2.5} constituents estimated by different models.

CI, confidence interval. Other abbreviations are in [Tables](#page-3-0) 1 and 2.

 a Percent change (95% CI) in single-pollutant models and PM_{2.5}-adjusted models is for each IQR increase in $PM_{2.5}$ constituent exposure. The IQR of BC, OC, SO_4^{2-} ,NO₃, NH₄, and Cl[−] is 1.75 μg/m³, 1855 μg/m³, 5.06 μg/m³, 8.30 μg/ m³, 4.34 μg/m³, and 1.66 μg/m³, respectively. Percent change (95% CI) in constituent-residual models is for each IQR increase in $PM_{2.5}$ constituent residual. The IQR for the residual to BC OC, SO $^{2-}_4$, NO $_3^-$, NH $^+_4$, and Cl $^-$ was 0.64 µg/ m³, 3.29 μg/m³, 2.15 μg/m³, 2.43 μg/m³, 1.15 μg/m³, and 0.65 μg/m³, respectively.

3 studies, the associations with insignificant or relatively low estimates may be partly attributable to the low accuracy of exposure assessment. Because these studies assessed the community/county/city-level exposure using a $PM_{2.5}$ constituents grid dataset evaluated by the modified Community Multiscale Air Quality (CMAQ) model (spatial resolution: 36 km \times 36 km) as the substitute for exposure at an individual level, they assumed that ambient PM2.5 constituent levels were homogeneous in a large spatial area. However, because the concentrations of some PM2.5 chemical species, especially traffic-related constituents (e.g., BC), showed high spatial variability at a small spatial scale, (Bell et al., [2011](#page-7-0); Ito et al., [2004](#page-7-0); [Wang](#page-7-0) et al., 2022; [Yang](#page-8-0) et al., 2020) it may cause exposure misclassification for failing to capture the exposure variability within the study region, which may further underestimate associations ([Hutcheon](#page-7-0) et al., 2010; Wu et al., [2023](#page-8-0)). In comparison, we used a PM2.5 constituents grid dataset with high spatiotemporal resolution to evaluate the individual-level exposure on each study subject's home address, which provided more accurate estimations of $PM_{2.5}$ constituent exposure and reliable results on exposure-response analyses.

Our findings suggest that BC and SO_4^{2-} exposures play an important role in PM_2 ₅-induced MI mortality and alleviating exposure to BC and SO_4^{2-} in PM_{2.5} mass may be feasible to prevent premature MI deaths. However, due to deficient knowledge of the deleterious effect linked to $PM_{2.5}$ constituents, there is no air quality standard on specific constituents to date. Our study emphasized the significance of controlling specific constituents in ambient particulate management and offered quantitative data to build tailored guidelines on toxic PM2.5 constituents. Moreover, because BC is largely attributed to the incomplete combustion process of fossil fuels and biomass, while SO_4^{2-} primarily emitted from fuel-based transportation, coal-fired power plants, and industrial burning, (Cai et al., [2023](#page-7-0); Shen et al., [2022](#page-7-0)) the importance of controlling anthropogenic combustion emissions needs to be highlighted, such as improving burning efficiency and giving priority to low-sulfur fuels or renewable energies.

The pathophysiological mechanism of the acute detrimental impact of PM2.5 constituent exposures on MI death may mainly relate to the promotion of thrombosis and atherosclerosis (Feng et al., [2022;](#page-7-0) [Zhao](#page-8-0) et al., [2021\)](#page-8-0). Several epidemiological studies identified that exposure to PM2.5 constituents, especially BC, was linked to elevated biomarkers associated with oxidative stress, inflammation, and cardiac injury, which may facilitate endothelium and vascular dysfunction, increase blood coagulability, and further accelerate thrombosis and atherosclerosis ([Azzouz](#page-7-0) et al., 2023; Hu et al., [2021](#page-7-0); Lin et al., [2015](#page-7-0); [Roy](#page-7-0) et al., [2014;](#page-7-0) [Wang](#page-7-0) et al., 2022). Moreover, $PM₂₅$ constituent exposures can rise atherosclerotic plaque vulnerability and cause plaque instability [\(Xu](#page-8-0) et al., [2019](#page-8-0)). These mechanisms may induce stenosis or obstruction in the coronary artery and ultimately trigger MI. In this study, we identified that subjects aged \geq 80 years were more susceptible to PM_{2.5} constituent exposure in MI death, which may be related to their higher physiological vulnerability, comorbidities, chronic low-grade inflammation, and medication interaction (Liu et al., [2021b](#page-7-0), [2022b](#page-7-0)).

Our study has some strengths. First, benefiting from the high-quality

Table 4

CI, confidence interval. Other abbreviations are in [Tables](#page-3-0) 1 and 2.

The IQR of BC, OC, SO_4^2 -, NO₃, NH₄, and Cl⁻ is 1.75 μg/m³, 18.55 μg/m³, 5.06 μg/m³, 8.30 μg/m³, 4.34 μg/m³, and 1.66 μg/m³, respectively.

^a *p* for difference.

Fig. 3. Excess fraction (95% CI) and number of excess deaths (95% CI) from MI associated with black carbon and sulfate exposure above the theoretical minimal risk exposure concentration.

CI, confidence interval. Other abbreviations are in [Tables](#page-3-0) 1 and 2. The theoretical minimal risk exposure concentration for black carbon and sulfate was 0.89 μ g/m³ and 1.51 μ g/m³, respectively.

PM2.5 constituents grid dataset, we were able to evaluate short-term exposure to PM2.5 constituents for each subject grounding on the home address, which offered a more precise exposure assessment in comparison with previous studies that relied on a single monitoring site or grid data with a relatively coarse spatial resolution to estimate regionscale exposure as the proxy of individual-level exposure. Second, we included a large number of MI death cases (over 0.2 million) from a provincial population exceeding 80 million in 7 years, which allowed us to detect the potential acute influence of $PM_{2.5}$ constituents on MI death with adequate statistical power and representative estimates. Finally, the case-crossover design enabled us to investigate the associations at an individual level and controlled time-invariant individual confounding variables, long-term trends, and weather conditions.

Some limitations need to be considered when interpreting our study findings. First, although we estimated relatively accurate $PM_{2.5}$ constituent exposure for each subject, we were incapable of evaluating the actual personal exposure because of the unavailable information on individual indoor pollutant exposure and time-activity patterns. However, its bias may be partly migrated because the pollutant exposures indoors were highly correlated with that at ambient [\(Krebs](#page-7-0) et al., 2021) and the time-activity pattern was less likely to vary dramatically in a calendar month under the case-crossover design. Second, we utilized the time-stratified case-crossover design to adjust for weather conditions and the time-invariant confounders, but there possibly remained some remanent confounding factors (e.g., medication use). Third, because the relationships between exposure to $\rm PM_{2.5}$ constituents and MI death were only investigated within one single province of China, caution ought to be paid when extrapolating our results to populations of other regions. Fourth, we solely focused on the effect of carbonaceous compounds and

WSIIs on MI mortality but did not investigate other constituents in PM2.5 (e.g., metals), although carbonaceous compounds and WSIIs form the majority of $PM_{2.5}$ mass. Fifth, because OC concentrations were not measured directly but computed by deducting the concentration of other constituents from the total $PM_{2.5}$ in our study, there may be bias in the exposure assessment of OC and further affect the accuracy of the study results. Finally, since we did not have detailed information on the specific MI type of each study subject, our ability to investigate the association between $PM_{2.5}$ constituents and different type of MI death (e.g., ST-elevation MI [STEMI] and non-STEMI) was limited. Further studies are warranted to clarify the effect of PM2.5 constituent exposures on specific MI, which could provide more significant implications to clinical practices.

5. Conclusions

In summary, we utilized a high-quality $PM_{2.5}$ constituents grid dataset to conduct individual-level exposure assessment for 237,492 MI deaths, and identified that short-term exposure to BC and SO_4^2 bounding to PM2.5 was associated with increased odds of MI death and may result in extensive excess mortality, notably in older adults. Our findings offer useful evidence that BC and SO_4^{2-} may play an important role in PM2.5-induced MI death, which highlights the necessity of developing air quality guidelines on specific constituents in ambient particulate management and reducing the emission of toxic constituents to prevent premature deaths from MI.

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CRediT authorship contribution statement

Yingxin Li: Writing – review & editing, Writing – original draft, Visualization, Methodology, Formal analysis. **Bing Lu:** Writing – review & editing, Methodology, Formal analysis. **Jing Wei:** Writing – review & editing, Data curation. **Qingqing Wang:** Writing – review & editing. **Wancheng Ma:** Writing – review & editing. **Rui Wang:** Writing – review & editing. **Ruijun Xu:** Writing – review & editing. **Zihua Zhong:** Writing – review & editing. **Lu Luo:** Writing – review & editing. **Xi Chen:** Writing – review & editing. **Ziquan Lv:** Writing – review & editing. **Suli Huang:** Writing – review & editing. **Hong Sun:** Writing – review & editing, Supervision, Project administration, Methodology, Data curation, Conceptualization. **Yuewei Liu:** Writing – review & editing, Supervision, Project administration, Methodology, Data curation, Conceptualization.

Declaration of competing interest

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

Data availability

The data that has been used is confidential.

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None.

Appendix A. Supplementary data

Supplementary data to this article can be found online at [https://doi.](https://doi.org/10.1016/j.chemosphere.2024.143101) [org/10.1016/j.chemosphere.2024.143101.](https://doi.org/10.1016/j.chemosphere.2024.143101)

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