



ELSEVIER

Contents lists available at ScienceDirect

Environment International

journal homepage: [www.elsevier.com/locate/envint](http://www.elsevier.com/locate/envint)

## Two-way effect modifications of air pollution and air temperature on total natural and cardiovascular mortality in eight European urban areas

Kai Chen<sup>a,\*</sup>, Kathrin Wolf<sup>a</sup>, Susanne Breitner<sup>a</sup>, Antonio Gasparrini<sup>b</sup>, Massimo Stafoggia<sup>c</sup>, Evangelia Samoli<sup>d</sup>, Zorana Jovanovic Andersen<sup>e</sup>, Getahun Bero-Bedada<sup>f</sup>, Tom Bellander<sup>f,g</sup>, Frauke Hennig<sup>h</sup>, Bénédicte Jacquemin<sup>i,j</sup>, Juha Pekkanen<sup>k,l</sup>, Regina Hampel<sup>a</sup>, Josef Cyrus<sup>a</sup>, Annette Peters<sup>a</sup>, Alexandra Schneider<sup>a</sup>, on behalf of the UF&HEALTH Study Group

<sup>a</sup> Institute of Epidemiology, Helmholtz Zentrum München–German Research Center for Environmental Health, Neuherberg, Germany

<sup>b</sup> Department of Social and Environmental Health Research, London School of Hygiene & Tropical Medicine, London, UK

<sup>c</sup> Lazio Region Health Service, Department of Epidemiology, Italy

<sup>d</sup> Department of Hygiene, Epidemiology and Medical Statistics, National and Kapodistrian University of Athens, Athens, Greece

<sup>e</sup> Department of Public Health, Center for Epidemiology and Screening, University of Copenhagen, Copenhagen, Denmark

<sup>f</sup> Institute of Environmental Medicine, Karolinska Institutet, Stockholm, Sweden

<sup>g</sup> Stockholm County Council, Centre for Occupational and Environmental Medicine, Stockholm, Sweden

<sup>h</sup> Institute for Occupational, Social and Environmental Medicine, Center for health and Society, University of Düsseldorf, Düsseldorf, Germany

<sup>i</sup> INSERM-Aging and Chronic Diseases, Epidemiological and Public Health Approaches (VIMA), Villejuif, France

<sup>j</sup> Barcelona Institute for Global Health - Campus MAR (ISGlobal), Barcelona, Spain

<sup>k</sup> Department of Public Health, University of Helsinki, Helsinki, Finland

<sup>l</sup> Environment and Health Unit, National Institute for Health and Welfare (THL), Kuopio, Finland

### ARTICLE INFO

Handling editor: Xavier Querol

#### Keywords:

Ultrafine particles  
Particulate matter  
Ozone  
Air temperature  
Mortality  
Effect modification

### ABSTRACT

**Background:** Although epidemiological studies have reported associations between mortality and both ambient air pollution and air temperature, it remains uncertain whether the mortality effects of air pollution are modified by temperature and vice versa. Moreover, little is known on the interactions between ultrafine particles (diameter  $\leq 100$  nm, UFP) and temperature.

**Objective:** We investigated whether the short-term associations of particle number concentration (PNC in the ultrafine range ( $\leq 100$  nm) or total PNC  $\leq 3000$  nm, as a proxy for UFP), particulate matter  $\leq 2.5$   $\mu\text{m}$  (PM<sub>2.5</sub>) and  $\leq 10$   $\mu\text{m}$  (PM<sub>10</sub>), and ozone with daily total natural and cardiovascular mortality were modified by air temperature and whether air pollution levels affected the temperature-mortality associations in eight European urban areas during 1999–2013.

**Methods:** We first analyzed air temperature-stratified associations between air pollution and total natural (nonaccidental) and cardiovascular mortality as well as air pollution-stratified temperature-mortality associations using city-specific over-dispersed Poisson additive models with a distributed lag nonlinear temperature term in each city. All models were adjusted for long-term and seasonal trend, day of the week, influenza epidemics, and population dynamics due to summer vacation and holidays. City-specific effect estimates were then pooled using random-effects meta-analysis.

**Results:** Pooled associations between air pollutants and total and cardiovascular mortality were overall positive and generally stronger at high relatively compared to low air temperatures. For example, on days with high air temperatures ( $> 75$ th percentile), an increase of 10,000 particles/cm<sup>3</sup> in PNC corresponded to a 2.51% (95% CI: 0.39%, 4.67%) increase in cardiovascular mortality, which was significantly higher than that on days with low air temperatures ( $< 25$ th percentile) [ $-0.18\%$  (95% CI:  $-0.97\%$ ,  $0.62\%$ )]. On days with high air pollution ( $> 50$ th percentile), both heat- and cold-related mortality risks increased.

**Conclusion:** Our findings showed that high temperature could modify the effects of air pollution on daily mortality and high air pollution might enhance the air temperature effects.

\* Corresponding author at: Institute of Epidemiology, Helmholtz Zentrum München, Ingolstädter Landstr. 1, 85764 Neuherberg, Germany.  
E-mail address: [kai.chen@helmholtz-muenchen.de](mailto:kai.chen@helmholtz-muenchen.de) (K. Chen).

## 1. Introduction

Exposure to ambient air pollution has been identified as a leading contributor to the global disease burden which caused 4.5 million deaths in 2015 (Cohen et al., 2017). Meanwhile, a large number of epidemiological studies has shown adverse impacts of exposure to both high and low ambient air temperatures on mortality (Basu and Samet, 2002; Curriero et al., 2002; Guo et al., 2014; Ma et al., 2014). Given the increasing concern regarding the health impacts of climate change, interest has grown recently in estimating the joint effects of air pollution and air temperature on health. However, little is known about the potential interaction between air temperature and air pollution, which is crucial for estimating their joint health effects.

Meteorological conditions affect surface air quality by influencing emissions, atmospheric chemistry, and pollutant transport (Fiore et al., 2015). Especially, ground-level ozone (O<sub>3</sub>) is formed by chemical reactions between nitrogen oxides and volatile organic compounds in the presence of sunlight and high temperature (Crutzen, 1974; Sillman, 1999). Thus, air pollution can be influenced by air temperature. In studies assessing air pollution health effects, air temperature is usually controlled for as a confounder rather than a modifier (Chen et al., 2013; Li et al., 2017). The potential effect modification of air pollution on mortality by air temperature has been largely neglected, until recently, in epidemiological studies (Stafoggia et al., 2008). On the other hand, air pollution may amplify people's vulnerability to the adverse effects of temperature (Gordon, 2003) and could act as an effect modifier in the short-term effects of air temperature on mortality (Breitner et al., 2014; Ren et al., 2006). This effect modification of temperature health effects by air pollution may be of great importance to public health benefits because air temperature is expected to continue to rise over the 21st century under all emission scenarios (IPCC, 2013), whereas air pollution can be reduced in a few decades to yield measurable improvements in public health (Breitner et al., 2009; Pope III et al., 2009). Thus, both directions of effect modification, hence the two-way effect modifications, matter for public health under a warming climate and changing air quality.

Although a few studies have examined the modifying effect by air temperature on particulate matter (PM)- and O<sub>3</sub>-associated mortality, results are inconsistent regarding: (1) the direction of the interaction: most studies reported stronger PM or O<sub>3</sub> effects on days with high air temperatures (Jhun et al., 2014; Kim et al., 2015; Li et al., 2011; Qian et al., 2008; Ren et al., 2008a; Stafoggia et al., 2008), whereas few also reported stronger air pollution effects on days with low air temperatures (Chen et al., 2013; Cheng and Kan, 2012; Sun et al., 2015); (2) the significance of interaction: among 12 studies of PM effects on daily total nonaccidental mortality, only six found statistically significant interactions, five observed nonsignificant interactions, and one reported significance only in Southern Chinese cities (Li et al., 2017; Meng et al., 2012). In contrast, only a limited number of studies have evaluated the modifying effect of air pollution on air temperature-related mortality (Breitner et al., 2014; Li et al., 2015; Ren et al., 2006). PM was found as a significant effect modifier in the association between temperature and total and cardiovascular mortality in Brisbane, Australia (Ren et al., 2006) and Guangzhou, China (Li et al., 2015), but not in three cities of Bavaria, Germany (Breitner et al., 2014). However, these studies have important limitations in characterizing the complex interaction between air temperature and air pollution: first, their analyses were based on a single city analysis; second, they assumed a linear effect, a single lag, or a moving average lag structure for temperature, therefore simplifying to a great extent the nonlinear and delayed temperature-mortality dependencies (Gasparrini et al., 2015b).

Epidemiological evidence on whether air temperature modifies the effect of ultrafine particles (UFP) and vice versa is lacking, mostly due to the unavailability of routinely collected relevant data. UFP are hypothesized to have a high and independent toxic potential due to their small size (< 100 nm), large active surface area, and their ability to

penetrate into the pulmonary alveoli and to translocate in the circulation (Brook et al., 2010; HEI Review Panel on Ultrafine Particles, 2013). Few epidemiological studies have reported a (weak) positive association between short-term UFP exposure and mortality (Atkinson et al., 2010; Breitner et al., 2011; Breitner et al., 2009; Lanzinger et al., 2016; Stafoggia et al., 2017).

In the present study, we aimed to investigate the two-way effect modifications of air pollution (UFP, PM, and O<sub>3</sub>) and air temperature on total (nonaccidental) and cardiovascular mortality in eight European urban areas. This study is the result of a collaborative effort among the Ultrafine Particles and Health (UF&HEALTH) Study Group in Europe (Stafoggia et al., 2017). The UF&HEALTH Study aimed to gather available data on UFP measures and mortality over a relatively long time period from cities across Europe to enlarge statistical power to detect weak associations (Samoli et al., 2016).

## 2. Methods

### 2.1. Data collection

Daily mortality, air pollution, and air temperature data during 1999–2013 were collected from eight European urban areas: Athens (Greece), Augsburg (Germany), Barcelona (Spain), Copenhagen (Denmark), Helsinki (Finland), Rome (Italy), Ruhr area (three adjacent cities including Essen, Mülheim, and Oberhausen, Germany), and Stockholm (Sweden) (Supplemental Information, Fig. S1). Detailed description of the study areas, including main sources of air pollution, are reported in the Supplemental Information, Text S1.

Daily death counts of urban residents were provided by each participating center of the UF&HEALTH Study Group. Mortality data were classified into the following categories using the International Classification of Diseases, 9th revision (ICD-9) and the International Statistical Classification of Diseases and Related Health Problems, 10th revision (ICD-10): deaths from total natural (ICD-9 1-799 and ICD-10 A00-R99) and cardiovascular (ICD-9 390-459 and ICD-10 I00-I99) causes. Respiratory mortality was not investigated because our previous study did not find associations of UFP and PM with respiratory mortality (Stafoggia et al., 2017). For total natural mortality, daily counts were also stratified by sex and age (0–74 years and 75 and above years). The two age groups (nonelderly vs. elderly) were used for analysis as previous studies suggested that the elderly are more vulnerable to the mortality risks of air pollution and air temperature (Anderson and Bell, 2009; Bell et al., 2005; Hajat et al., 2007; Samoli et al., 2008).

Daily mean particle number concentration (PNC, as a surrogate for UFP (HEI Review Panel on Ultrafine Particles, 2013)) was obtained from independent monitoring campaigns in each city. In all cities, one urban or suburban background PNC monitoring site was used, except for a traffic site in Rome. Due to different monitoring instruments used in different cities, PNC was measured in slightly different size ranges (Supplemental Information, Table S1). For Athens, Copenhagen, and Helsinki, PNC was available in the ultrafine range ( $\leq 100$  nm), in the other cities total PNC ( $\leq 3000$  nm) was used as it is often assumed that particles in the ultrafine range dominated PNC (HEI Review Panel on Ultrafine Particles, 2013). In each city, we further collected daily 24-h average PM with an aerodynamic diameter  $\leq 2.5$   $\mu\text{m}$  (PM<sub>2.5</sub>) and  $\leq 10$   $\mu\text{m}$  (PM<sub>10</sub>) and daily maximum 8-h average O<sub>3</sub> concentrations from multiple stations of the local air quality monitoring networks. Daily concentrations were averaged from all valid monitoring stations in each city, which had at least 75% of the daily data for the study period. For details with regard to air pollution data collection we refer to the preceding publication (Stafoggia et al., 2017). As in previous studies, daily mean air temperature was used as the metric for temperature (Chen et al., 2016; Gasparrini et al., 2015b). Data on daily mean air temperature were collected from local meteorological services or airport meteorological networks. Relative humidity was not collected

since previous studies showed robust air temperature effects on daily mortality when additionally adjusting for relative humidity (Breitner et al., 2014; Gasparrini et al., 2015b; Guo et al., 2014). Influenza epidemics (a dummy variable denoting days with particularly high influenza episodes) were identified from national surveillance systems and hospitalization records.

## 2.2. Statistical analysis

### 2.2.1. Basic confounder model

We used Poisson additive models with over-dispersion to estimate the city-specific associations between mortality and air pollutants or air temperature. Several confounders were included in the city-specific models: (1) natural cubic spline with eight degrees of freedom ( $df$ ) per year to control for long-term and seasonal trend, (2) indicator variables for day of the week, (3) an indicator variable for influenza epidemics, (4) an indicator variable for population dynamics due to summer vacation and holidays (Stafoggia et al., 2017), and (5) a penalized distributed lag nonlinear temperature term using marginal P-spline smoothers with dimension 7 for both exposure and lag spaces and a maximum lag of 21 days. The penalized distributed lag nonlinear temperature term was characterized as a cross-basis matrix, which had 42 ( $7 \times 6$ ) parameters for the bi-dimensional space of the exposure and lags. Penalization was implemented through a double varying penalty with a second-order difference penalty and a ridge penalty (Gasparrini et al., 2017). Because of the different lag periods for heat effect (within a few days) and cold effect (up to 3 or 4 weeks) (Anderson and Bell, 2009; Gasparrini et al., 2015b), we applied a maximum of 21 lag days for temperature.

### 2.2.2. Air pollution effects stratified by air temperature

To examine effect modification by air temperature in each city, we categorized air temperature into three levels: high ( $> 75$ th city-specific percentile), medium (25th–75th city-specific percentile), and low ( $< 25$ th city-specific percentile). Consistent with prior studies (Chen et al., 2013; Jhun et al., 2014; Ren et al., 2008a), the 25th and 75th percentiles were used as temperature cut-offs. In addition, compared with other percentile cut-offs (5th and 95th, 10th and 90th, 15th and 95th, 20th and 80th), this percentile cut-offs could yield similar estimates but with narrower confidence intervals due to increased sample size in the low and high temperature levels (Chen et al., 2013; Jhun et al., 2014). After defining the basic confounder model, we introduced the interaction terms between air pollutant (PNC,  $PM_{2.5}$ ,  $PM_{10}$ , and  $O_3$  in turn) and categorized air temperature at the same lag structure. Due to the multiple missing data in many of the air pollution series (Supplemental Information, Table S2), we could not compute averages over multiple days for air pollution. Based on our previous analysis (Stafoggia et al., 2017), we chose lag 6 for PNC and lag 1 for other pollutants. Heterogeneity among city-specific air pollution effects was assessed by the  $I^2$  statistic from Cochran's Q test. Heterogeneity was considered to be significant if  $I^2 > 0.5$ , moderately significant if  $0.25 < I^2 \leq 0.5$ , and nonsignificant if  $I^2 \leq 0.25$  (Higgins et al., 2003).

### 2.2.3. Air temperature effects stratified by air pollution concentrations

For each city, we introduced an interaction term between the above mentioned penalized distributed lag nonlinear temperature term and an air pollutant strata indicator in the basic confounder model. To examine effect modification by air pollutants, we divided the air pollutants (PNC at lag 6,  $PM_{2.5}$ ,  $PM_{10}$ , and  $O_3$  at lag 1) into two levels: high ( $>$  city-specific median value) and low ( $\leq$  city-specific median value). Air pollution was categorized into two levels rather than three levels in order to ensure enough statistical power for the parameters in the cross-basis matrix of temperature and its interaction term with air pollution strata indicator. As the short-term effects of air pollutants are generally within several days (Bell et al., 2005; Samoli et al., 2008), we did not use the same cumulative lag structure (lag0–21) for air pollution and

air pollution categories. To adjust for potential residual confounding, the air pollutant was also included as a linear continuous term in the model. The overall cumulative exposure-response curves for temperature and mortality were estimated along percentiles of the average temperature distribution in the eight European urban areas under study, with a minimum mortality temperature percentile between the first and the 99th percentiles as the reference temperature (Gasparrini et al., 2015b). Relative, city-specific temperature percentiles were used to characterize differences in temperature distributions and population acclimatization to temperature changes in cities with different climate conditions (Guo et al., 2014; Jhun et al., 2014). Because the average temperature distributions were similar in different strata of PNC and PM but different in different strata of  $O_3$  (Supplemental Information, Table S3), we constructed overall cumulative exposure-response relationships for each strata of air pollutants and represented these curves on a relative scale, along percentiles of the overall average temperature distribution. In addition, we calculated heat effects as cumulative mortality risk at the 99th percentile relative to the 90th percentile and cold effects as cumulative mortality risk at the 1st percentile relative to the 10th percentile. Since the 99th percentile (25.6 °C) is larger than the maximum value of temperature in low ozone levels, we calculated the heat effects in low ozone levels by comparing its maximum value (24.4 °C) with the 90th percentile (21.5 °C). The overall lag-response relationships for heat and cold effects across the lag period (0–21) were estimated separately.

City-specific effect estimates were pooled using univariate random-effects meta-analyses (Gasparrini et al., 2012). For temperature effects, city-specific coefficients for the cross-basis term were first pooled and then the pooled coefficients were used to reconstruct overall cumulative exposure-response associations on a relative scale using average temperature distribution percentiles (Gasparrini et al., 2015a). We tested the statistical significance of differences between the pooled estimates of the temperature or air pollutant strata by calculating the 95% confidence interval (CI) as  $(\hat{Q}_1 - \hat{Q}_2) \pm 1.96\sqrt{(SE_1)^2 + (SE_2)^2}$ , where  $\hat{Q}_1$  and  $\hat{Q}_2$  are the estimates, and  $SE_1$  and  $SE_2$  are their respective standard errors (Zeka et al., 2006). We also tested the statistical significance of differences between the overall temperature-mortality associations at low and high air pollution levels using a multivariate Wald test based on the pooled reduced coefficients of the cross-basis matrix of temperature (Gasparrini et al., 2015a).

## 2.3. Sensitivity analyses

We performed several sensitivity analyses by changing the  $df$  (6–10 per year) for time trend and using alternative maximum lag days for temperature (14 and 28 days). In addition, when analyzing modifications of the air pollution effects by air temperature, different cutoffs (20th/80th, 15th/85th, and 10th/90th) and lag days (lag 0 to lag 6) for temperature categories were also explored. Moreover, we fitted two-pollutant models by adding other co-pollutants one at a time to account for potential confounding from multiple exposures. Additionally, we explored whether differences in city-specific characteristics such as average temperature, temperature range, average air pollution level, and total number of population were associated with the estimated temperature-stratified air pollution effects. Using potential city-specific characteristics as additional meta-predictors, we then performed sensitivity analyses to pool the city-specific results using multivariate meta-regression models (Gasparrini et al., 2012). Furthermore, we tested effect modification by sex and age group performing gender- and age-specific subgroup analyses. Besides, we compared the results of using UFP (3–100 nm) with using total PNC (10–2000 nm) in Augsburg during 2004–2009. Finally, as Rome was previously found to dominate the pooled effects of PNC on mortality (Stafoggia et al., 2017), we also checked the influence of Rome on the modification of air pollution effects by air temperature through removing it from the meta-analyses.

**Table 1**  
Descriptive statistics for study period, daily deaths, and cutoffs for air pollutants and air temperature in eight European cities.

	Helsinki	Stockholm	Copenhagen	Ruhr Area	Augsburg	Rome	Barcelona	Athens
Study period	2001–2010	2001–2005, 2008–2010	2001–2010	2009–2013	1999–2009	2001–2010	2005–2010	2008–2010
Daily mortality (mean ± sd)								
Total natural	18 ± 5	39 ± 7	26 ± 9	32 ± 6	8 ± 3	58 ± 10	41 ± 8	80 ± 12
Cardiovascular	7 ± 3	16 ± 4	8 ± 4	12 ± 4	4 ± 2	24 ± 6	13 ± 4	36 ± 7
Air pollutants percentiles (median)								
PNC (particles/cm <sup>3</sup> )								
Min	793	2113	503	1513	2243	2295	1926	582
25th	4658	6210	3285	7523	7184	19,384	13,807	3775
50th	6636	8150	4685	9740	9977	29,168	18,696	5599
75th	9868	10,910	6382	12,331	13,728	44,202	24,663	8696
Max	38,761	44,170	21,260	28,905	44,755	139,640	50,929	36,024
PM <sub>2.5</sub> (µg/m <sup>3</sup> )								
Min	0	1	0	4	1	0	2	5
25th	5	5	9	10	10	13	15	16
50th	7	7	11	14	15	18	20	20
75th	11	9	15	22	21	24	28	26
Max	57	37	70	128	126	73	104	63
PM <sub>10</sub> (µg/m <sup>3</sup> )								
Min	1	3	2	4	4	7	4	7
25th	10	9	14	14	19	26	23	24
50th	13	12	18	19	29	33	32	32
75th	19	17	23	28	40	44	43	42
Max	116	82	100	131	169	174	190	291
O <sub>3</sub> (µg/m <sup>3</sup> )								
Min	2	5	0	3	3	1	1	10
25th	48	51	26	36	45	42	41	49
50th	62	64	33	55	67	75	65	71
75th	76	78	40	75	93	100	83	91
Max	159	129	77	196	190	199	142	138
Air temperature percentiles (°C)								
Min	−24.2	−17.9	−8.1	−11.0	−12.9	−0.4	0	−1.8
1st	−18.0	−11.3	−4.5	−4.6	−7.8	2.6	1.7	4.9
10th	−6.5	−2.9	0.4	1.6	−0.9	6.6	6.4	10.0
25th	−0.7	1.2	4.3	6.4	3.6	10.2	9.5	13.8
50th	5.7	7.0	9.4	11.5	10	15.6	14.7	18.3
75th	13.7	13.9	15.2	16.7	16.2	21.9	19.6	25.5
90th	17.9	17.7	18.7	19.9	20.2	25.8	22.7	29.3
99th	22.8	22.3	22.9	25.2	24.9	28.9	25.7	32.2
Max	26.6	25.1	25.5	29.6	27.7	31	28.3	33.6

All analyses were performed with R software, version 3.2.1 (R Foundation for Statistical Computing, Vienna, Austria), using the packages mgcv (Wood, 2011), dlnm (Gasparrini, 2011), and mvmeta (Gasparrini et al., 2012).

### 3. Results

#### 3.1. Descriptive statistics

Table 1 summarizes daily mortality counts and cutoffs for air pollution and temperature strata in the eight European cities. Different research periods with available data on UFP measurements and mortality were investigated across different cities. During the study period, there were overall 742,526 total natural deaths in the eight cities, among which 39.3% were cardiovascular deaths. Daily total and cardiovascular mortality were highest in Athens and lowest in Augsburg. Median values of daily PNC ranged from 4685 particles/cm<sup>3</sup> in Copenhagen to 29,168 particles/cm<sup>3</sup> in Rome. Cutoffs for both air pollutants and air temperature were generally higher in the Southern cities. The correlations of PNC with PM, ozone, and air temperature, and correlations between PM and temperature were weak to moderate in each city (Supplemental information, Fig. S2). On the contrary, ozone was moderately to strongly positively correlated with air temperature.

#### 3.2. Air pollution effects modified by temperature

Table 2 shows that the pooled effects of PNC, PM, and ozone on

daily mortality varied by temperature levels. Associations between increases in air pollutants and mortality were generally stronger at high compared to low air temperatures. For example, a 10,000 particles/cm<sup>3</sup> increase in PNC at lag 6 was associated with percent increases in cardiovascular mortality of −0.18% (95% CI: −0.97%, 0.62%), 0.81% (95% CI: −1.92%, 0.32%), and 2.51% (95% CI: 0.39%, 4.67%) at low, medium, and high air temperatures, respectively. The corresponding effect estimates on total mortality at each temperature level for a 10 µg/m<sup>3</sup> increase in PM<sub>2.5</sub> were −0.46% (95% CI: −1.02%, 0.12%), 0.84% (95% CI: 0.05%, 1.63%), and 2.36% (95% CI: 0.11%, 4.65%). Non-significant or moderately significant heterogeneity ( $I^2 \leq 0.5$ ) across different cities was observed for associations between mortality and PNC, PM<sub>10</sub>, and O<sub>3</sub>, whereas significant heterogeneity ( $I^2 > 0.5$ ) was found for associations between mortality and PM<sub>2.5</sub> at high temperatures (Table 2 and Supplemental information, Fig. S3–S6).

#### 3.3. Air temperature effects modified by air pollutants

In the basic confounder model, the pooled air temperature-mortality associations were U-shaped and significant for both total natural and cardiovascular mortality (Fig. 1). The lag-response relationships showed that heat effects were limited within the first week while cold effects lasted two to three weeks. No harvesting effect (deaths advanced by a few days) or mortality displacement was observed for both heat and cold effects.

Fig. 2 shows the pooled estimates of the exposure-response relationship between air temperature and total and cardiovascular

**Table 2**

Percent increase (95% CI) in daily total natural and cardiovascular mortality associated with a 10,000 particles/cm<sup>3</sup> increase in PNC or a 10 µg/m<sup>3</sup> increase in PM<sub>2.5</sub>, PM<sub>10</sub>, and O<sub>3</sub> at different temperature levels.

Pollutant	Temperature levels <sup>a</sup>	Total natural		Cardiovascular	
		% increase	I <sup>2</sup>	% increase	I <sup>2</sup>
PNC_lag6	Low	0.08 (−0.44, 0.61)	7%	−0.18 (−0.97, 0.62)	2%
	Medium	−0.49 (−1.08, 0.11)	0%	−0.81 (−1.92, 0.32)	0%
	High	1.24 (−0.72, 3.24)	28%	2.51 (0.39, 4.67) <sup>b,c</sup>	0%
PM <sub>2.5</sub> _lag1	Low	−0.46 (−1.02, 0.12)	0%	−0.03 (−0.91, 0.87)	12%
	Medium	0.84 (0.05, 1.63) <sup>b</sup>	47%	1.22 (0.35, 2.10) <sup>b</sup>	0%
	High	2.36 (0.11, 4.65) <sup>b</sup>	74%	3.58 (0.46, 6.81) <sup>b</sup>	66%
PM <sub>10</sub> _lag1	Low	0.03 (−0.32, 0.38)	0%	0.23 (−0.43, 0.9)	8%
	Medium	0.28 (0.01, 0.55)	34%	0.25 (−0.16, 0.66)	0%
	High	0.93 (0.31, 1.55) <sup>b</sup>	0%	1.61 (0.73, 2.50) <sup>b,c</sup>	0%
O <sub>3</sub> _lag1	Low	0.17 (−0.14, 0.49)	0%	0.44 (−0.05, 0.93)	0%
	Medium	0.24 (−0.08, 0.57)	34%	0.69 (0.07, 1.31)	55%
	High	0.67 (0.36, 0.98) <sup>b</sup>	0%	0.54 (0.06, 1.02)	0%

<sup>a</sup> The 25th and 75th percentiles of daily mean temperature were used as temperature cut-offs.

<sup>b</sup> Significantly different from the low temperature level.

<sup>c</sup> Significantly different from the medium temperature level.

mortality at low and high air pollution levels. Associations between high temperatures and mortality were generally stronger at high PNC, PM, and O<sub>3</sub> levels. Estimates for low temperatures and mortality were much stronger at high PNC levels compared to low PNC levels, while were similar at PM and O<sub>3</sub> strata, with overlapping CIs. The results of the multivariate Wald test indicated evidence ( $p < 0.05$ ) of significant differences in the exposure-response curves for total natural mortality stratified by PM and O<sub>3</sub> levels.

Table 3 reports the overall cumulative mortality risk of heat exposure (99th percentile relative to 90th percentile of air temperature) and cold exposure (1st percentile relative to 10th percentile of air temperature) by air pollutant strata. In general, both heat and cold effects on total and cardiovascular mortality were stronger at high air pollution levels. For example, heat exposure was associated with an increase in cardiovascular mortality by 19.02% (95% CI: −13.24%, 46.68%) at high PNC levels and 3.75% (95% CI: 0.29%, 7.33%) at low PNC levels. Cold-related cardiovascular mortality risk was also higher at high PNC levels (16.23%; 95% CI: 3.80%, 30.14%), compared to low PNC levels (2.00%; 95% CI: 0.16%, 3.88%).

### 3.4. Subgroup and sensitivity analyses

In population subgroup analyses, we did not find substantially different interactions between air temperature and PNC, PM, and O<sub>3</sub> on total natural mortality across age groups and sex (data not shown). Sensitivity analyses indicated that our results were robust when we changed  $df$  for time-trend (Supplemental Information, Figs. S7 and S8), used different percentile cutoffs of air temperature categories, and different lag periods for the air temperature effect (data not shown). Choosing different lag days for air temperature categories did not materially change the temperature-stratified air pollution effects on mortality (Supplemental information, Fig. S9). After adjustment for co-pollutants, the pattern of effect modification on air pollution-related mortality by air temperature did not change substantially (Supplemental information, Fig. S10). The effects of PNC on mortality across air temperature levels decreased after adjustment for PM<sub>2.5</sub> but remained similar when controlling for PM<sub>10</sub> and ozone. Estimates of PM-related mortality across air temperature levels were robust when we controlled for PNC and ozone. Effect modification of ozone-related mortality by air temperature persisted after adjustment for PNC and PM. When we considered potential predictors (average temperature, temperature range, and population) of the city-specific risk estimates (Supplemental information, Fig. S11), we found similar temperature-stratified air pollution effects (Supplemental information, Fig. S12) and

air pollution-stratified temperature effects (Supplemental information, Fig. S13). Using UFP instead of total PNC generated similar results in Augsburg (Supplemental Information, Fig. S14). When we excluded Rome from the meta-analyses, the pooled effect modification of PNC- and PM-related cardiovascular mortality risks by high temperatures became nonsignificant, whereas effect modification of PM<sub>2.5</sub>-related total natural mortality by high temperatures remained statistically significant (data not shown).

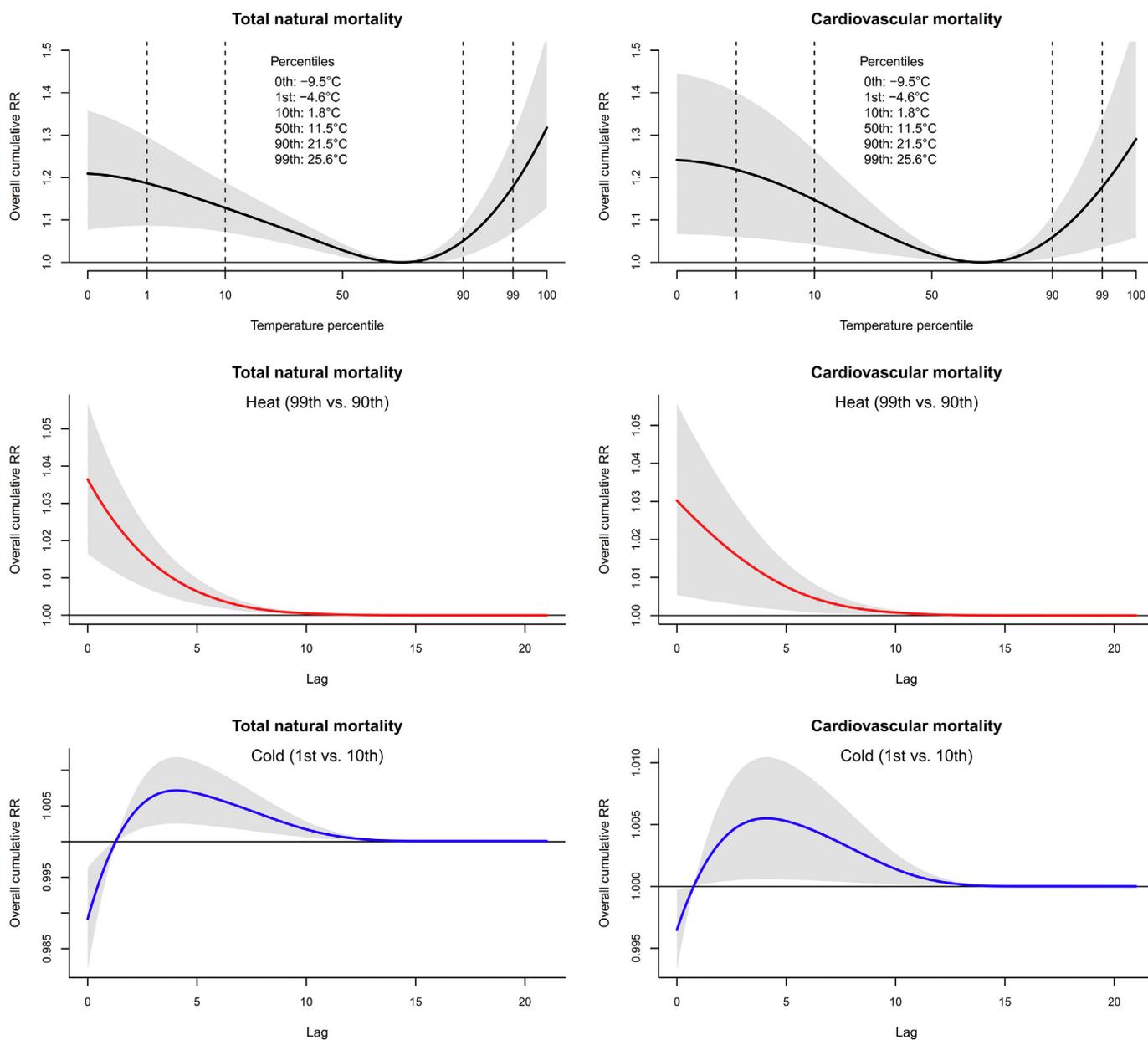
## 4. Discussion

To the best of our knowledge, this is the first time-series study to examine the interactions between UFP and air temperature on total natural and cardiovascular mortality. Our multi-city analyses in eight European urban areas showed that high temperatures could significantly enhance the effect of PNC on cardiovascular mortality, the effects of PM<sub>2.5</sub> and PM<sub>10</sub> on total natural and cardiovascular mortality, and the effects of O<sub>3</sub> on total natural mortality. Furthermore, our results showed that the air temperature effects on mortality were greater at high air pollution levels. Significant effect modification was found on heat-related total natural mortality by PM<sub>2.5</sub>, PM<sub>10</sub>, and O<sub>3</sub>, and on cold-related total natural and cardiovascular mortality by PNC.

### 4.1. Effect modification of air pollution effects by temperature

We found stronger PM effects on mortality on days with high air temperatures. Similarly, high temperatures were found to enhance the acute effect of PM on mortality in Australia (Ren and Tong, 2006), China (Li et al., 2011; Meng et al., 2012; Qian et al., 2008; Qin et al., 2017), South Korea (Kim et al., 2015), and Europe (Katsouyanni et al., 2001; Pascal et al., 2014; Shaposhnikov et al., 2014; Stafoggia et al., 2008). In the present analysis, an increase of 10 µg/m<sup>3</sup> in PM<sub>10</sub> was associated with 0.03% (95% CI: −0.32%, 0.38%), 0.28% (95% CI: 0.01%, 0.55%), and 0.93% (95% CI: 0.31%, 1.55%) increase of total natural mortality at low, medium, and high temperatures. Our results were consistent with a recent meta-analysis, which reported a 0.19% (95% CI: −0.01%, 0.40%), 0.31% (95% CI: 0.21%, 0.42%) and 0.78% (95% CI: 0.44%, 1.11%) increase in total natural mortality per 10 µg/m<sup>3</sup> increase in PM<sub>10</sub> at study-specific low, medium, and high temperatures (Li et al., 2017). Moreover, in our study we observed a high heterogeneity of the PM<sub>2.5</sub> effects between the cities and therefore our results should be regarded with caution.

In accordance with our PM analysis, we also found stronger UFP effects on daily mortality on days with high temperatures. However, the

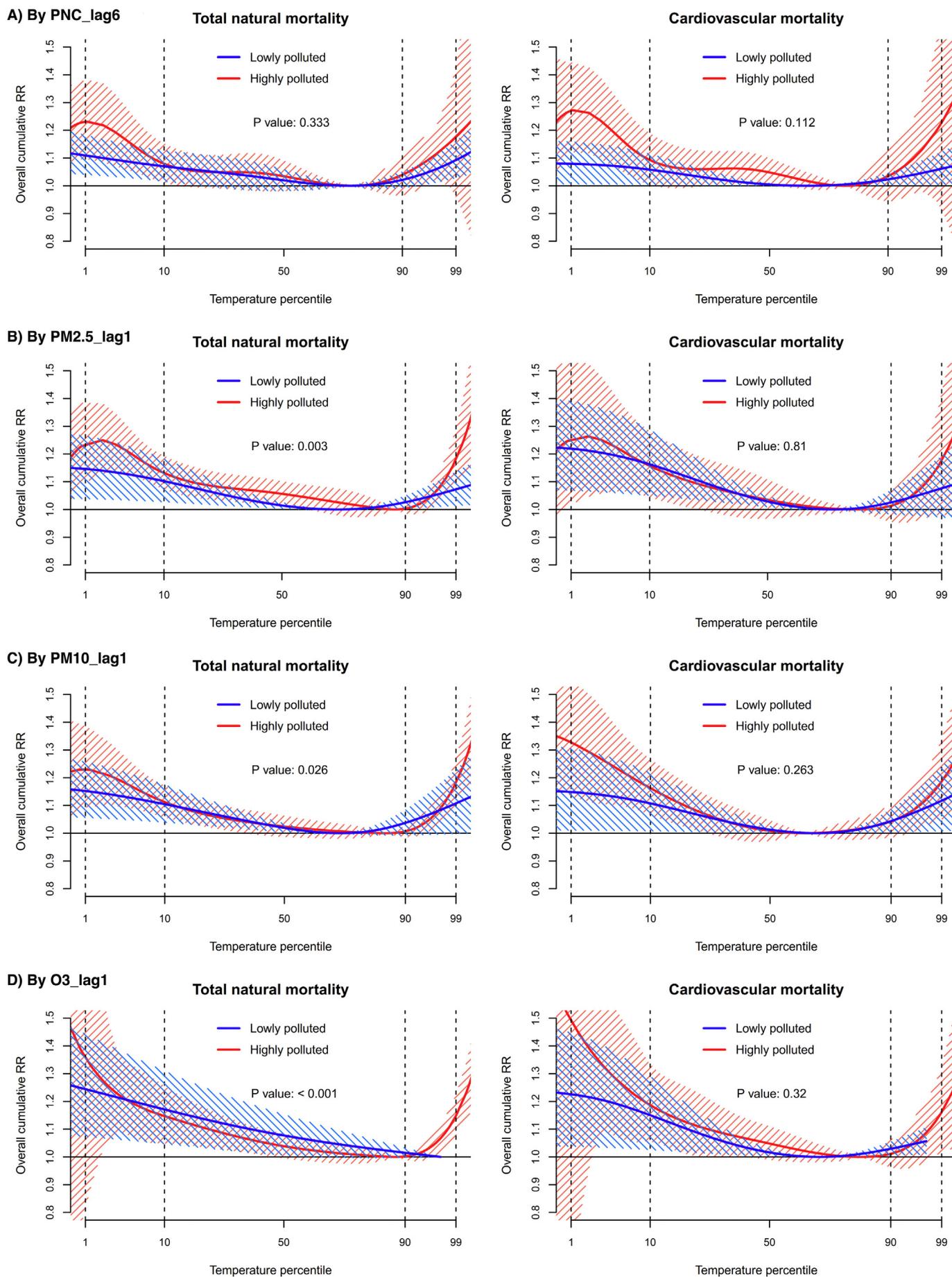


**Fig. 1.** Overall cumulative exposure-response relationships and lag-response relationships between air temperature and mortality with 95% CIs. The vertical lines in (A) and (B) represent the 1st, 10th, 90th, and 99th percentiles of the air temperature distribution. The y-axis in (A) and (B) represents the relative risk of air temperature on daily mortality compared with the minimum mortality temperature; in (C) and (D) represents the relative risk of heat effect (99th percentile vs. 90th percentile) on daily mortality; and in (E) and (F) represents the relative risk of cold effect (1st percentile vs. 10th percentile) on daily mortality.

effect modification was only significant for cardiovascular mortality. Evidence from very few studies on the seasonal association between PNC and mortality indicate that UFP effects may be larger in the warm season (Meng et al., 2013; Stafoggia et al., 2017), which provides support for our findings. Effect estimates were robust after adjustment for PM<sub>10</sub> and O<sub>3</sub>, but weaker after adjustment for PM<sub>2.5</sub>. In contrast, the temperature-stratified PM<sub>2.5</sub> effects on mortality remained robust after adjustment of co-pollutants, which suggests independent effects of PM<sub>2.5</sub>. This contrasting effects indicates some residual confounding in PNC effects due to co-exposure to PM<sub>2.5</sub>. However, the contrasting results between PNC and PM<sub>2.5</sub> should be interpreted with caution due to different size fractions of PNC measured in different cities. Except for Athens, Copenhagen, and Helsinki, total PNC ( $\leq 3000$  nm) rather than PNC at ultrafine range ( $\leq 100$  nm) was measured (Supplemental Information, Table S1). In previous studies measuring UFP at ultrafine range ( $\leq 100$  nm), the mortality effects of UFP remained similar when

adjusting for PM<sub>2.5</sub> (Lanzinger et al., 2016) or mass concentration metrics (Breitner et al., 2011).

City-specific effect modification of PNC effects by temperature showed different patterns, where largest effects occurring at high temperatures were observed in Athens, Augsburg, Barcelona, Helsinki, and Rome, but not in Copenhagen, Ruhr area, and Stockholm (Supplemental Information, Fig. S3). This difference may be due to different source contributions to UFP in different cities. A previous study evidenced that in Northern and Central EU cities PNC and black carbon (BC) had a similar hourly pattern, whereas in Southern EU cities, maximum PNC occurred at midday with minimum BC levels due to midday nucleation episodes (Reche et al., 2011). To quantify the sources and processes contributing to UFP, it can be segregated into two components based on the high correlation between BC and PNC: N1, the primary emission of vehicle exhaust, and N2, the newly formed secondary origin from mostly nucleation processes and other low BC-



(caption on next page)

**Fig. 2.** Modified overall cumulative air temperature-mortality associations by air pollution with 95% CIs. Blue lines represent for low air pollution level (concentration below median value) and red lines represent a high air pollution level (concentration above median value). The vertical lines represent the 1st, 10th, 90th, and 99th percentiles of the air temperature distribution. The y-axis represents the relative risk of temperature on daily mortality compared to the minimum mortality temperature. *P* value is the result of significance test between air pollution levels, based on a multivariate Wald test of the pooled reduced coefficients of the temperature effects at low and high air pollution levels. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)

bearing UFPs from different sources (Brines et al., 2015; Cheung et al., 2011; Rodríguez and Cuevas, 2007). Short-term effects of UFP on daily mortality are affected by different origins of UFP. A recent study in three Spanish cities found an association of daily mortality with N1 but not with N2 in Barcelona and Santa Cruz de Tenerife, which were influenced by traffic emissions, whereas an association with N2 was observed in an industrial city Huelva (Tobías et al., 2018). Thus, different source contributions of UFP in our eight EU cities may lead to different effects of PNC on daily mortality. Further studies with both PNC and BC measurements are needed to differentiate modification effects of primary and secondary UFP on health by air temperature. Furthermore, city-specific modified PNC effects by temperature on total mortality were not fully explained by those effects on cardiovascular mortality. This suggests that PNC may have effects on other causes of deaths.

A small number of studies have examined the modifying effect of air temperature on ozone-related mortality and the results are inconsistent (Li et al., 2017). In line with our findings, significant effect modifications of the association between O<sub>3</sub> and mortality with stronger effects on warmer days were found in the U.S. (Jhun et al., 2014; Ren et al., 2008a) and France (Pascal et al., 2012). On the contrary, stronger O<sub>3</sub> effects on colder days were observed in several cities in China (Chen et al., 2013; Cheng and Kan, 2012; Liu et al., 2013). This difference may be likely due to inadequate control of cold effects in these studies by using short lags for temperature in the ozone-mortality association. A previous study in 21 East Asia cities demonstrated that adjusting only for short lags of temperature could result in higher ozone effect estimates in winter than in summer (Chen et al., 2014).

#### 4.2. Effect modification of temperature effects by air pollution

Effect modification by air pollution on air temperature-mortality relationships has been barely investigated. We observed higher heat- and cold-related mortality risks at high air pollution levels, with significant effect modification by PM<sub>2.5</sub>, PM<sub>10</sub>, and O<sub>3</sub> on heat-related mortality risks and by PNC on cold-related mortality risks (Table 3). Similar findings on PM<sub>10</sub> and O<sub>3</sub> were obtained by time-series studies conducted in Guangdong, China (Li et al., 2015), Brisbane, Australia

(Ren et al., 2006), 95 U.S. communities (Ren et al., 2008b), Berlin, Germany, and Lisbon, Portugal (Burkart et al., 2013), and three cities of Bavaria, Germany (Breitner et al., 2014). Another study using a case-crossover design also reported larger heat effects on mortality at high PM<sub>10</sub> concentrations in Rotterdam, The Netherlands (Willers et al., 2016). No prior investigations have assessed the modifying effect of short-term exposure to PNC and PM<sub>2.5</sub> on temperature-mortality associations.

#### 4.3. Plausible biological mechanism

Although the underlying biological mechanism of effect modification of air pollution and temperature on mortality is not fully understood, several hypotheses have been proposed. Firstly, PM, O<sub>3</sub>, and air temperature may have synergistic effects on cardiovascular system as they have common pathophysiological pathways. Air temperature changes (higher or lower) are associated with increased blood viscosity and coagulability, elevated cholesterol levels, and inflammatory responses (Keatinge et al., 1986; Schneider et al., 2008). Increased UFP and PM can also cause increased blood pressure and platelet aggregation, systemic oxidative stress and inflammation (Brook et al., 2010; Ruckerl et al., 2011). In addition, both airborne particles and temperature were associated with changes in heart rate and repolarization parameters among myocardial infarction survivors (Hampel et al., 2010). On the other hand, ozone at high temperatures may impair fibrinolysis, thus reducing the efficiency of preventing clot formation and clearance (Kahle et al., 2015). Second, high temperatures could increase thermoregulatory stress and alter the physiological response to toxicants, leading to a higher susceptibility to air pollution effects (Gordon, 2003). Third, population exposures to air pollution might increase during the warm season (Meng et al., 2013) as people tend to go more outside and to keep windows open and at the same time the chemical composition of UFP (Kim et al., 2002) and PM (Bell et al., 2007) could vary by season. In addition, secondary UFPs formed from mostly nucleation events contributed as a major component of UFP in Australian and European cities (Brines et al., 2015; Salma et al., 2014). Because nucleation events generally occurred at midday with high

**Table 3**

Pooled cumulative mortality risks (percent increase and 95% CI) of daily total natural and cardiovascular mortality associated with heat exposure (99th percentile relative to 90th percentile of air temperature) and cold exposure (1st percentile relative to 10th percentile of air temperature) by air pollutant strata.

Effect	Pollutant	Pollutant levels <sup>a</sup>	Total natural	Cardiovascular
Heat	PNC_lag6	Low	6.94 (2.76, 11.29)	3.75 (0.29, 7.33)
		High	13.22 (−10.78, 43.67)	19.02 (−13.24, 46.68)
	PM <sub>2.5</sub> _lag1	Low	4.53 (0.97, 8.21)	4.99 (−1.15, 7.56)
		High	17.71 (7.98, 28.31) <sup>b</sup>	16.10 (−1.62, 37.02)
	PM <sub>10</sub> _lag1	Low	6.78 (0.53, 13.42)	7.04 (0.51, 9.69)
		High	17.39 (9.95, 25.33) <sup>b</sup>	13.69 (1.84, 26.91)
O <sub>3</sub> _lag1	Low	−2.08 (−4.43, 0.32)	3.90 (0.69, 7.22)	
	High	14.61 (8.24, 21.36) <sup>b</sup>	14.83 (2.35, 28.83)	
Cold	PNC_lag6	Low	3.64 (1.00, 6.35)	2.00 (0.16, 3.88)
		High	14.06 (4.45, 24.55) <sup>b</sup>	16.23 (3.80, 30.14) <sup>b</sup>
	PM <sub>2.5</sub> _lag1	Low	4.00 (1.08, 7.00)	4.85 (1.71, 8.08)
		High	9.39 (−1.71, 21.74)	8.38 (−7.67, 27.21)
	PM <sub>10</sub> _lag1	Low	4.32 (1.50, 7.21)	3.71 (0.28, 7.26)
		High	10.53 (0.24, 21.88)	14.18 (0.11, 30.22)
	O <sub>3</sub> _lag1	Low	6.24 (1.72, 10.96)	6.58 (1.17, 12.29)
		High	18.39 (−31.1, 103.42)	25.75 (−51.47, 225.85)

<sup>a</sup> The median value for each pollutant in each city was used as cut-offs for air pollution levels.

<sup>b</sup> Significantly different from the low air pollution levels.

temperature and low levels of nitrogen oxides (Brines et al., 2015), source contribution of UFP may greatly differ at low and high temperatures. Seasonal variations in both chemical composition and source contribution of UFP may affect its toxicity, which was observed to be higher in the summer (Baldauf et al., 2016).

#### 4.4. Strengths and limitations

The eight European cities with PNC measurements offer advantages for the study of the interactions between UFP and air temperature on daily mortality for the first time to our knowledge. Furthermore, this study benefits from analyses on different particle sizes (UFP, PM<sub>2.5</sub>, and PM<sub>10</sub>) and the potential synergistic role of temperatures. Another main strength of this study is the multi-city design with standardized protocols for health data collection covering a wide range of locations in Europe with different climates, which can provide robust results and may avoid potential publication bias that commonly occur in single-city studies. Moreover, disentangling interactions between the air pollution and air temperature on health is challenging in part because of their different lag structures and a different shape of their exposure-response functions (Zanobetti and Peters, 2015). In the present analysis on effect modification by air pollutant, rather than using a linear, single lagged or moving averaged temperature term, we applied a distributed lag nonlinear temperature term, which captures the complex non-linear and lagged dependencies in both the exposure-response and lag-response associations (Gasparrini et al., 2015b). In the interaction term, this distributed lag nonlinear temperature term was added together with a linear single lagged air pollution strata. Thus, our models characterizing interactions with different lag structures and different exposure-response functions may better assess the complex interplay between air pollutants and air temperature on daily mortality.

Several limitations should be acknowledged in this study. First, there were potential exposure measurement errors because we used measured air pollution and air temperature at fixed outdoor monitoring stations. This measurement error may be especially relevant to UFP as it is known to have a high spatial variation within cities (HEI Review Panel on Ultrafine Particles, 2013). However, this concern was lessened to some extent as we analyzed the temporal variations in time-series models and the temporal correlations across different sites within a city were generally high (Cyrus et al., 2008). Second, different air pollution measurement instruments were used and slightly different size fractions of PNC were collected in different cities (Stafoggia et al., 2017), which might limit the direct comparison among cities and introduce differential exposure measurement errors. Third, the UFP measurements in Rome were influenced by traffic and had much higher particle number concentrations, which may increase the statistical power and lead to the dominating role of Rome in the pooled PNC effects (Stafoggia et al., 2017). Moreover, the multiple missing data in air pollution measurements prevented us from conducting a sensitivity analysis using the same cumulative lag structure for air temperature and air pollutants in assessing their interactions. Furthermore, due to power issue we did not examine whether the observed effect modifications varied by season. Further study is warranted to investigate the seasonal interactions between air pollution and air temperature. Another limitation is that by testing multiple air pollutants, temperature, and total and cardiovascular mortality, the possibility that some of the observed significant effect modifications might occur by chance cannot be fully excluded. In addition, our results might not be generalized to health impact assessments in another region with different basic health status and air pollution compositions (Krzyzanowski et al., 2002).

#### 5. Conclusion

Overall, our findings showed that the association between daily total natural and cardiovascular mortality and air pollution (UFP, PM<sub>2.5</sub>, PM<sub>10</sub>, and ozone) was modified by air temperature and vice

versa. Results therefore suggest that interactions between air pollution and air temperature should be considered to assess their joint health effects. Our findings point to the importance of understanding and reducing the health burdens attributable to ambient air pollution and air temperature in the context of climate change. Further studies are needed to investigate the effect modification of air pollution and air temperature using morbidity data (i.e. hospitalization, emergency room visits) to get a more comprehensive knowledge of the air temperature-pollution interaction.

#### Founding

K.C was supported by the Alexander von Humboldt Foundation (Humboldt Research Fellowships for postdoctoral researchers). A.G. was supported by the Medical Research Council UK (Grant ID: MR/M022625/1).

#### Conflict of interest

The authors declare no conflicts of interests.

#### Acknowledgements

We thank the Instituto Nacional de Estadística and the Agència de Salut Pública de Barcelona for providing the mortality data and the Agencia Estatal de Meteorología (Ministerio de Agricultura, Alimentación y Medio Ambiente) for providing the weather data for Spain. We thank the Institute of Environmental Assessment and Water Research (IDAEA-CSIC, Barcelona, Spain) for providing the air pollution data for Spain. Colleagues from IDAEA-CSIC were supported by the project PI15/00515, integrated in the National Plan for I + D + I and co-funded by the ISCIII-Directorate General for Evaluation and the European Regional Development Fund (FEDER). We thank “Information und Technik NRW, Düsseldorf, 2014” and “Landesamt für Natur, Umwelt und Verbraucherschutz Land NRW, Recklinghausen, [www.lanuv.nrw](http://www.lanuv.nrw)” for providing, respectively, mortality and exposure data for the three cities of the Ruhr Area. We thank Dr. H. Ott from the Bavarian Environmental Agency (Bayerisches Landesamt für Umwelt) for providing the air pollution and meteorological data from Augsburg, Germany. The UFP measurements in Augsburg were exclusively granted by the Helmholtz Zentrum München. We thank Helsinki Region Environmental Services Authority HSY for providing the air pollution (other than UFP) data from Helsinki, Finland. We also thank Finnish Meteorological Institute for providing the weather data and Statistics Finland for providing the mortality data for Finland. The study has been conducted as a collaborative effort of the UF&HEALTH Study Group. UF&HEALTH Study Group: S. Breitner, J. Cyrus, R. Hampel, F. Hennig, B. Hoffmann, T. Kuhlbusch; S. Lanzinger, A. Peters, U. Quass, A. Schneider, K. Wolf (Germany); E. Diapouli, K. Eleftheriadis, K. Katsouyanni, E. Samoli, S. Vratolis (Greece); T. Ellermann, Z. Ivanovic-Andersen, S. Loft, A. Massling, C. Nordström (Denmark); P. P. Aalto, M. Kulmala, T. Lanki, J. Pekkanen, P. Tiittanen, T. Yli-Tuomi (Finland); G. Cattani, A. Faustini, F. Forastiere, M. Inglessis, M. Renzi, M. Stafoggia (Italy); D. Agis, X. Basagaña, B. Jacquemin, N. Perez, J. Sunyer, A. Tobias (Spain); T. Bellander, G. Bero-Bedada (Sweden).

#### Appendix A. Supplementary data

Supplementary data to this article can be found online at <https://doi.org/10.1016/j.envint.2018.04.021>.

#### References

- Anderson, B.G., Bell, M.L., 2009. Weather-related mortality: how heat, cold, and heat waves affect mortality in the United States. *Epidemiology* 20, 205–213.
- Atkinson, R.W., Fuller, G.W., Anderson, H.R., Harrison, R.M., Armstrong, B., 2010. Urban

- ambient particle metrics and health: a time-series analysis. *Epidemiology* 21, 501–511.
- Baldauf, R.W., Devlin, R.B., Gehr, P., Giannelli, R., Hassett-Sipple, B., Jung, H., et al., 2016. Ultrafine particle metrics and research considerations: review of the 2015 UF workshop. *Int. J. Environ. Res. Public Health* 13, 1054.
- Basu, R., Samet, J.M., 2002. Relation between elevated ambient temperature and mortality: a review of the epidemiologic evidence. *Epidemiol. Rev.* 24, 190–202.
- Bell, M.L., Dominici, F., Samet, J.M., 2005. A meta-analysis of time-series studies of ozone and mortality with comparison to the National Morbidity, Mortality, and Air Pollution Study. *Epidemiology* 16, 436–445.
- Bell, M.L., Dominici, F., Ebisu, K., Zeger, S.L., Samet, J.M., 2007. Spatial and temporal variation in PM<sub>2.5</sub> chemical composition in the United States for health effects studies. *Environ. Health Perspect.* 115, 989–995.
- Breitner, S., Stölzel, M., Cyrys, J., Pitz, M., Wölke, G., Kreyling, W., et al., 2009. Short-term mortality rates during a decade of improved air quality in Erfurt, Germany. *Environ. Health Perspect.* 117, 448.
- Breitner, S., Liu, L., Cyrys, J., Brüske, I., Franck, U., Schlink, U., et al., 2011. Sub-micrometer particulate air pollution and cardiovascular mortality in Beijing, China. *Sci. Total Environ.* 409, 5196–5204.
- Breitner, S., Wolf, K., Devlin, R.B., Diaz-Sanchez, D., Peters, A., Schneider, A., 2014. Short-term effects of air temperature on mortality and effect modification by air pollution in three cities of Bavaria, Germany: a time-series analysis. *Sci. Total Environ.* 485, 49–61.
- Brines, M., Dall'Osto, M., Beddows, D.C.S., Harrison, R.M., Gómez-Moreno, F., Núñez, L., et al., 2015. Traffic and nucleation events as main sources of ultrafine particles in high-insolation developed world cities. *Atmos. Chem. Phys.* 15, 5929–5945.
- Brook, R.D., Rajagopalan, S., Pope, C.A., Brook, J.R., Bhatnagar, A., Diez-Roux, A.V., et al., 2010. Particulate matter air pollution and cardiovascular disease. *Circulation* 121, 2331.
- Burkart, K., Canário, P., Breitner, S., Schneider, A., Scherber, K., Andrade, H., et al., 2013. Interactive short-term effects of equivalent temperature and air pollution on human mortality in Berlin and Lisbon. *Environ. Pollut.* 183, 54–63.
- Chen, K., Yang, H.B., Ma, Z.W., Bi, J., Huang, L., 2013. Influence of temperature to the short-term effects of various ozone metrics on daily mortality in Suzhou, China. *Atmos. Environ.* 79, 119–128.
- Chen, R., Cai, J., Meng, X., Kim, H., Honda, Y., Guo, Y.L., et al., 2014. Ozone and daily mortality rate in 21 cities of East Asia: how does season modify the association? *Am. J. Epidemiol.* 180, 729–736.
- Chen, K., Zhou, L., Chen, X., Ma, Z., Liu, Y., Huang, L., et al., 2016. Urbanization level and vulnerability to heat-related mortality in Jiangsu Province, China. *Environ. Health Perspect.* 124, 1863–1869.
- Cheng, Y., Kan, H., 2012. Effect of the interaction between outdoor air pollution and extreme temperature on daily mortality in Shanghai, China. *J. Epidemiol.* 22, 28–36.
- Cheung, H.C., Morawska, L., Ristovski, Z.D., 2011. Observation of new particle formation in subtropical urban environment. *Atmos. Chem. Phys.* 11, 3823–3833.
- Cohen, A.J., Brauer, M., Burnett, R., Anderson, H.R., Frostad, J., Estep, K., et al., 2017. Estimates and 25-year trends of the global burden of disease attributable to ambient air pollution: an analysis of data from the Global Burden of Diseases Study 2015. *Lancet* 389, 1907–1918.
- Cutzen, P.J., 1974. Photochemical reactions initiated by and influencing ozone in unpolluted tropospheric air. *Tellus* 26, 47–57.
- Curriero, F.C., Heiner, K.S., Samet, J.M., Zeger, S.L., Strug, L., Patz, J.A., 2002. Temperature and mortality in 11 cities of the Eastern United States. *Am. J. Epidemiol.* 155, 80–87.
- Cyrys, J., Pitz, M., Heinrich, J., Wichmann, H.-E., Peters, A., 2008. Spatial and temporal variation of particle number concentration in Augsburg, Germany. *Sci. Total Environ.* 401, 168–175.
- Fiore, A.M., Naik, V., Leibensperger, E.M., 2015. Air quality and climate connections. *J. Air Waste Manage. Assoc.* 65, 645–685.
- Gasparrini, A., 2011. Distributed lag linear and non-linear models in R: the package dlnm. *J. Stat. Softw.* 43, 1–20.
- Gasparrini, A., Armstrong, B., Kenward, M.G., 2012. Multivariate meta-analysis for non-linear and other multi-parameter associations. *Stat. Med.* 31, 3821–3839.
- Gasparrini, A., Guo, Y.M., Hashizume, M., Kinney, P.L., Petkova, E.P., Lavigne, E., et al., 2015a. Temporal variation in heat-mortality associations: a multicountry study. *Environ. Health Perspect.* 123, 1200–1207.
- Gasparrini, A., Guo, Y.M., Hashizume, M., Lavigne, E., Zanobetti, A., Schwartz, J., et al., 2015b. Mortality risk attributable to high and low ambient temperature: a multi-country observational study. *Lancet* 386, 369–375.
- Gasparrini, A., Scheipl, F., Armstrong, B., Kenward, M.G., 2017. A penalized framework for distributed lag non-linear models. *Biometrics* 73, 938–948.
- Gordon, C.J., 2003. Role of environmental stress in the physiological response to chemical toxicants. *Environ. Res.* 92, 1–7.
- Guo, Y., Gasparrini, A., Armstrong, B., Li, S., Tawatsupa, B., Tobias, A., et al., 2014. Global variation in the effects of ambient temperature on mortality: a systematic evaluation. *Epidemiology* 25, 781–789.
- Hajat, S., Kovats, R.S., Lachowycz, K., 2007. Heat-related and cold-related deaths in England and Wales: who is at risk? *Occup. Environ. Med.* 64, 93.
- Hampel, R., Schneider, A., Brüske, I., Zareba, W., Cyrys, J., Ruckerl, R., et al., 2010. Altered cardiac repolarization in association with air pollution and air temperature among myocardial infarction survivors. *Environ. Health Perspect.* 118, 1755.
- HEI Review Panel on Ultrafine Particles, 2013. Understanding the Health Effects of Ambient Ultrafine Particles. HEI Perspectives. vol. 3 Health Effects Institute, Boston, MA.
- Higgins, J.P.T., Thompson, S.G., Deeks, J.J., Altman, D.G., 2003. Measuring inconsistency in meta-analyses. *BMJ* 327, 557–560.
- IPCC, 2013. Summary for policymakers. In: Stocker, T.F., Qin, D., Plattner, G.-K., Tignor, M., Allen, S.K., Boschung, J., Nauels, A., Xia, Y., Bex, V., Midgley, P.M. (Eds.), *Climate Change 2013: The Physical Science Basis Contribution of Working Group I to the Fifth Assessment Report of the Intergovernmental Panel on Climate Change*. Cambridge University Press, Cambridge, United Kingdom and New York, NY, USA.
- Jhun, I., Fann, N., Zanobetti, A., Hubbell, B., 2014. Effect modification of ozone-related mortality risks by temperature in 97 US cities. *Environ. Int.* 73, 128–134.
- Kahle, J., Neas, L., Devlin, R., Case, M., Schmitt, M., Madden, M., et al., 2015. Interaction effects of temperature and ozone on lung function and markers of systemic inflammation, coagulation, and fibrinolysis: a crossover study of healthy young volunteers. *Environ. Health Perspect.* 123, 310–316.
- Katsouyanni, K., Touloumi, G., Samoli, E., Gryparis, A., Le Tertre, A., Monopoli, Y., et al., 2001. Confounding and effect modification in the short-term effects of ambient particles on total mortality: results from 29 European cities within the APHEA2 project. *Epidemiology* 12, 521–531.
- Keatinge, W.R., Coleshaw, S.R.K., Easton, J.C., Cotter, F., Mattock, M.B., Chelliah, R., 1986. Increased platelet and red cell counts, blood viscosity, and plasma cholesterol levels during heat stress, and mortality from coronary and cerebral thrombosis. *Am. J. Med.* 81, 795–800.
- Kim, S., Shen, S., Sioutas, C., Zhu, Y., Hinds, W.C., 2002. Size distribution and diurnal and seasonal trends of ultrafine particles in source and receptor sites of the Los Angeles basin. *J. Air Waste Manage. Assoc.* 52, 297–307.
- Kim, S.E., Lim, Y.-H., Kim, H., 2015. Temperature modifies the association between particulate air pollution and mortality: a multi-city study in South Korea. *Sci. Total Environ.* 524, 376–383.
- Krzyzanowski, M., Cohen, A., Anderson, R., 2002. Quantification of health effects of exposure to air pollution. *Occup. Environ. Med.* 59, 791.
- Lanzinger, S., Schneider, A., Breitner, S., Stafoggia, M., Erzen, I., Dostal, M., et al., 2016. Associations between ultrafine and fine particles and mortality in five central European cities — results from the UFIREG study. *Environ. Int.* 88, 44–52.
- Li, G., Zhou, M., Cai, Y., Zhang, Y., Pan, X., 2011. Does temperature enhance acute mortality effects of ambient particle pollution in Tianjin City, China. *Sci. Total Environ.* 409, 1811–1817.
- Li, L., Yang, J., Guo, C., Chen, P.-Y., Ou, C.-Q., Guo, Y., 2015. Particulate matter modifies the magnitude and time course of the non-linear temperature-mortality association. *Environ. Pollut.* 196, 423–430.
- Li, J., Woodward, A., Hou, X.-Y., Zhu, T., Zhang, J., Brown, H., et al., 2017. Modification of the effects of air pollutants on mortality by temperature: a systematic review and meta-analysis. *Sci. Total Environ.* 575, 1556–1570.
- Liu, T., Li, T.T., Zhang, Y.H., Xu, Y.J., Lao, X.Q., Rutherford, S., et al., 2013. The short-term effect of ambient ozone on mortality is modified by temperature in Guangzhou, China. *Atmos. Environ.* 76, 59–67.
- Ma, W., Chen, R., Kan, H., 2014. Temperature-related mortality in 17 large Chinese cities: how heat and cold affect mortality in China. *Environ. Res.* 134, 127–133.
- Meng, X., Zhang, Y., Zhao, Z., Duan, X., Xu, X., Kan, H., 2012. Temperature modifies the acute effect of particulate air pollution on mortality in eight Chinese cities. *Sci. Total Environ.* 435, 215–221.
- Meng, X., Ma, Y., Chen, R., Zhou, Z., Chen, B., Kan, H., 2013. Size-fractionated particle number concentrations and daily mortality in a Chinese city. *Environ. Health Perspect.* 121, 1174.
- Pascal, M., Wagner, V., Chatignoux, E., Falq, G., Corso, M., Blanchard, M., et al., 2012. Ozone and short-term mortality in nine French cities: influence of temperature and season. *Atmos. Environ.* 62, 566–572.
- Pascal, M., Falq, G., Wagner, V., Chatignoux, E., Corso, M., Blanchard, M., et al., 2014. Short-term impacts of particulate matter (PM<sub>10</sub>, PM<sub>10-2.5</sub>, PM<sub>2.5</sub>) on mortality in nine French cities. *Atmos. Environ.* 95, 175–184.
- Pope III, C.A., Ezzati, M., Dockery, D.W., 2009. Fine-particulate air pollution and life expectancy in the United States. *N. Engl. J. Med.* 360, 376–386.
- Qian, Z., He, Q., Lin, H.-M., Kong, L., Bentley, C.M., Liu, W., et al., 2008. High temperatures enhanced acute mortality effects of ambient particle pollution in the “oven” city of Wuhan, China. *Environ. Health Perspect.* 116, 1172.
- Qin, R.X., Xiao, C., Zhu, Y., Li, J., Yang, J., Gu, S., et al., 2017. The interactive effects between high temperature and air pollution on mortality: a time-series analysis in Hefei, China. *Sci. Total Environ.* 575, 1530–1537.
- Reche, C., Querol, X., Alastuey, A., Viana, M., Pey, J., Moreno, T., et al., 2011. New considerations for PM, Black Carbon and particle number concentration for air quality monitoring across different European cities. *Atmos. Chem. Phys.* 11, 6207–6227.
- Ren, C., Tong, S., 2006. Temperature modifies the health effects of particulate matter in Brisbane, Australia. *Int. J. Biometeorol.* 51, 87–96.
- Ren, C., Williams, G.M., Tong, S., 2006. Does particulate matter modify the association between temperature and cardiorespiratory diseases? *Environ. Health Perspect.* 114, 1690–1696.
- Ren, C., Williams, G.M., Mengersen, K., Morawska, L., Tong, S., 2008a. Does temperature modify short-term effects of ozone on total mortality in 60 large eastern US communities?—an assessment using the NMMAPS data. *Environ. Int.* 34, 451–458.
- Ren, C., Williams, G.M., Morawska, L., Mengersen, K., Tong, S., 2008b. Ozone modifies associations between temperature and cardiovascular mortality: analysis of the NMMAPS data. *Occup. Environ. Med.* 65, 255–260.
- Rodríguez, S., Cuevas, E., 2007. The contributions of “minimum primary emissions” and “new particle formation enhancements” to the particle number concentration in urban air. *J. Aerosol Sci.* 38, 1207–1219.
- Ruckerl, R., Schneider, A., Breitner, S., Cyrys, J., Peters, A., 2011. Health effects of particulate air pollution: a review of epidemiological evidence. *Inhal. Toxicol.* 23, 555–592.
- Salma, I., Borsós, T., Németh, Z., Weidinger, T., Aalto, P., Kulmala, M., 2014.

- Comparative study of ultrafine atmospheric aerosol within a city. *Atmos. Environ.* 92, 154–161.
- Samoli, E., Peng, R., Ramsay, T., Pipikou, M., Touloumi, G., Dominici, F., et al., 2008. Acute effects of ambient particulate matter on mortality in Europe and North America: results from the APHENA study. *Environ. Health Perspect.* 116, 1480–1486.
- Samoli, E., Andersen, Z.J., Katsouyanni, K., Hennig, F., Kuhlbusch, T.A., Bellander, T., et al., 2016. Exposure to ultrafine particles and respiratory hospitalisations in five European cities. *Eur. Respir. J.* 48, 674–682.
- Schneider, A., Panagiotakos, D., Picciotto, S., Katsouyanni, K., Löwel, H., Jacquemin, B., et al., 2008. Air temperature and inflammatory responses in myocardial infarction survivors. *Epidemiology* 19, 391–400.
- Shaposhnikov, D., Revich, B., Bellander, T., Bedada, G.B., Bottai, M., Kharkova, T., et al., 2014. Mortality related to air pollution with the Moscow heat wave and wildfire of 2010. *Epidemiology* 25, 359.
- Sillman, S., 1999. The relation between ozone, NO<sub>x</sub> and hydrocarbons in urban and polluted rural environments. *Atmos. Environ.* 33, 1821–1845.
- Stafoggia, M., Schwartz, J., Forastiere, F., Perucci, C., 2008. Does temperature modify the association between air pollution and mortality? A multicity case-crossover analysis in Italy. *Am. J. Epidemiol.* 167, 1476–1485.
- Stafoggia, M., Schneider, A., Cyrus, J., Samoli, E., Andersen, Z.J., Bedada, G.B., et al., 2017. Association between short-term exposure to ultrafine particles and mortality in eight European urban areas. *Epidemiology* 28, 172–180.
- Sun, S., Cao, P., Chan, K.-P., Tsang, H., Wong, C.-M., Thach, T.-Q., 2015. Temperature as a modifier of the effects of fine particulate matter on acute mortality in Hong Kong. *Environ. Pollut.* 205, 357–364.
- Tobías, A., Rivas, I., Reche, C., Alastuey, A., Rodríguez, S., Fernández-Camacho, R., et al., 2018. Short-term effects of ultrafine particles on daily mortality by primary vehicle exhaust versus secondary origin in three Spanish cities. *Environ. Int.* 111, 144–151.
- Willers, S.M., Jonker, M.F., Klok, L., Keuken, M.P., Odink, J., van den Elshout, S., et al., 2016. High resolution exposure modelling of heat and air pollution and the impact on mortality. *Environ. Int.* 89, 102–109.
- Wood, S.N., 2011. Fast stable restricted maximum likelihood and marginal likelihood estimation of semiparametric generalized linear models. *J. R. Stat. Soc.: Ser. C: Appl. Stat.* 73, 3–36.
- Zanobetti, A., Peters, A., 2015. Disentangling interactions between atmospheric pollution and weather. *J. Epidemiol. Community Health* 69, 613–615.
- Zeka, A., Zanobetti, A., Schwartz, J., 2006. Individual-level modifiers of the effects of particulate matter on daily mortality. *Am. J. Epidemiol.* 163, 849–859.