



**HAL**  
open science

# Vulnerability to Heat-related Mortality: A Systematic Review, Meta-analysis, and Meta-regression Analysis

Tarik Benmarhnia, Séverine Deguen, Jay S. Kaufman, Audrey Smargiassi

## ► To cite this version:

Tarik Benmarhnia, Séverine Deguen, Jay S. Kaufman, Audrey Smargiassi. Vulnerability to Heat-related Mortality: A Systematic Review, Meta-analysis, and Meta-regression Analysis. *Epidemiology*, 2015, 26 (6), pp.781-793. 10.1097/EDE.0000000000000375 . hal-01197347

**HAL Id: hal-01197347**

**<https://univ-rennes.hal.science/hal-01197347>**

Submitted on 28 Jan 2016

**HAL** is a multi-disciplinary open access archive for the deposit and dissemination of scientific research documents, whether they are published or not. The documents may come from teaching and research institutions in France or abroad, or from public or private research centers.

L'archive ouverte pluridisciplinaire **HAL**, est destinée au dépôt et à la diffusion de documents scientifiques de niveau recherche, publiés ou non, émanant des établissements d'enseignement et de recherche français ou étrangers, des laboratoires publics ou privés.

**Title:** Vulnerability to heat-related mortality: a systematic review, meta-analysis and metaregression analysis

**Authors**

Tarik Benmarhnia <sup>1,2</sup>, Séverine Deguen <sup>2,3</sup>, Jay S Kaufman <sup>4</sup>, Audrey Smargiassi <sup>1,5</sup> \*

(1) Université de Montréal, DSEST, Montréal, QC, Canada

(2) EHESP School of Public Health, Rennes, Sorbonne-Paris Cité, France

(3) INSERM U1085 (IRSET), Rennes, France

(4) Department of Epidemiology, Biostatistics, and Occupational Health, McGill University, Montreal, Quebec, Canada

(5) Institut National de Santé Publique du Québec, Montréal, QC, Canada

**Sources of financial support:** This work is supported by the EHESP School of Public Health and the School of Public Health of the University of Montreal (ESPUM).

### **Acknowledgments**

The authors are grateful to Lena Dolman for her useful comments and contribution in editing this paper.

**Conflict of interest:** None declared.

## **Abstract**

**Background:** Addressing vulnerability to heat-related mortality is a necessary step in the development of specific policies dictated by heat action plans. Epidemiologic studies can be used to orient such policies. The aim of this study was to provide a systematic assessment of the epidemiologic evidence regarding vulnerability to heat-related mortality.

**Methods:** Studies published between January 1980 and August 2014 were identified through PubMed and Elsevier Embase on the Ovid SP portal and in Web of Science. Studies assessing the association between high ambient temperature or heat-waves and mortality among different subgroups were selected. Estimates of association for all the included subgroups were extracted. We assessed the presence of heterogeneous effects between subgroups conducting Cochran Q tests. We then conducted random effect meta-analyses of ratios of relative risks (RRR) for high ambient temperature studies. Finally, we performed random effects meta-regression analyses to investigate factors associated with the magnitude of the RRR.

**Results:** Overall 61 studies were included in the review. Using the Cochran Q test we consistently found evidence of vulnerability for the elderly aged more than 85 years. We then found a pooled RRR of 0.99 (95% CI: 0.97, 1.01) for male sex, 1.02 (95% CI: 1.01, 1.03) for age>65 years, 1.04 (95% CI: 1.02, 1.07) for age>75 years, 1.03 (95% CI: 1.01, 1.05) for low individual socioeconomic status (SES) and 1.01 (95% CI: 0.99, 1.02) for low ecological socioeconomic status (SES). We found contrast definition use to be a determinant of heterogeneity in the pooled RRR.

**Conclusions:** We found strongest evidence of heat-related vulnerability for the elderly aged more than 65 years and more than 75 years and low SES groups (measured at the individual level). Further studies are needed to clarify if other subgroups like children or people living alone are also vulnerable to heat in order to inform public health programs.

**Keywords:** Vulnerability, heat, population health, temperature, temperature related mortality, climate change, meta-analysis.

## **Introduction**

Rising temperatures, and their impact on human mortality, are a primary public health concern in the context of climate change. Studies of heat and mortality have increased during the last two decades, particularly with the documentation of prominent events including heat waves in Chicago in 1995 <sup>1</sup> and in Western Europe in 2003 <sup>2</sup>. In the heat-related mortality literature, it is typical to distinguish two types of heat exposures: first, increases in ambient temperatures which can be defined as periods of high temperatures over single days, associated with mortality, and second, consecutive days of high heat also known as heat wave days, where population mortality is greater than on non-heat wave days. Many literature reviews <sup>3-8</sup> have examined the evidence for associations of mortality with elevated ambient temperatures, focusing on the variation of heat effect thresholds or heat slopes, as a measure of effect size <sup>7</sup>.

In epidemiologic studies of heat-related mortality, various subgroups have been identified as being more severely impacted, and are therefore defined as “vulnerable” <sup>9,10</sup>. Vulnerability is often used synonymously with susceptibility, although they are sometimes used to refer to separate processes related to whether the impacts are from external factors or intrinsic <sup>11</sup>.

Vulnerability can thus be defined as “the condition of having one or more interacting causes already and therefore being susceptible to the effect of the other” <sup>11</sup> or as “a greater likelihood of an adverse outcome given a specific exposure, compared with the general population; including both host (individual) and environmental (contextual) factors” <sup>12</sup>. Factors that mark greater vulnerability are modifiers of the association between an exposure and mortality, whenever the causal effect of the exposure of interest differs across levels of the modifying factor. Thus, there would be greater vulnerability in some subgroup whenever the causal effect of heat on mortality across two or more strata is heterogeneous.

Several individual or contextual subgroup characteristics marking greater vulnerability have been documented in the past decade of epidemiologic research. Individual vulnerability factors include age (elderly, children)<sup>3,13</sup>, sex, and socio economic factors (education, ethnicity, income, or social isolation)<sup>4</sup>. Contextual vulnerability factors include urban design (micro heat islands, population density), neighborhood (or ecologic) socioeconomic and community factors, and material conditions (air conditioning). These subgroups have mostly been identified in studies on the relationship between temperature, or heat waves, and mortality, using stratified analyses.

Addressing vulnerability to heat-related mortality is a necessary step in the development of heat action plans<sup>14</sup>, to orient specific actions towards sensible subgroups<sup>15,16</sup>. The need to consider vulnerable populations in heat action plans and other related policies is well recognized<sup>9,17,18</sup>.

The international epidemiologic literature can provide insights to orient policies dictated by heat action plans.

Yet, no study to date has systematically assessed the epidemiologic evidence concerning the characterization of vulnerable subgroups in the peer-reviewed heat-related mortality literature.

The aim of this review is thus to systematically assess heterogeneity in the heat mortality associations with respect to individual and contextual population characteristics.

## Methods

### *Search Strategy*

We identified peer-reviewed epidemiologic studies investigating potential heterogeneity in the associations between either high ambient temperature, or heat waves, and mortality, published between January 1980 and August 2014 in English. The search was conducted in September 2013 with an update in January 2015. The strategy used to conduct this review, in accordance with the PRISMA guidelines <sup>19</sup>, consisted of grouping keywords representing three categories: heat, mortality, and vulnerability (or heterogeneity). Keywords, titles, and abstracts were searched in PubMed and Elsevier Embase on the Ovid SP portal and in Web of Science as well. No restriction was put on the geographical location. The keywords used for this review were: (Heat OR climate OR environmental change OR heat stress OR hot weather OR high temperature OR heat effect OR hot effect OR hot temperature OR extreme temperature OR temperature) AND (Mortality OR health OR risk OR deaths) AND (vulnerability OR modif\* OR interaction OR susceptibility OR stratification OR differ\* OR hetero\*), where \* indicates any combination of subsequent letters.

### *Selection of studies*

First, we screened manually the abstracts of all studies selected in the literature search according to the following exclusion criteria:

- Studies without estimation of an association between mortality and heat.
- Studies reporting associations between mortality and heat only for the entire population and not for subgroups constituting vulnerability (as described in the introduction).
- Studies not performed on human populations.
- Commentaries, editorials, or review articles.

We examined remaining articles from the previous step in full. In this second step, we further screened studies or assessments within studies (i.e. by vulnerability subgroups) based on the following exclusion criteria:

- Studies or vulnerability subgroups (within a study) with either no comparison group or no reference group. If a study assessed only one of the strata for a given vulnerability factor, it was not possible to assess heterogeneity, thus such estimates were not considered. For instance, if a study assessed the association among individuals of 65 years and older, without giving the corresponding association for the 0-64 years age group, this study was excluded.
- Studies not reporting a non-heat wave reference period (i.e. when the heat-exposure did not differ) were also excluded. These studies were excluded because they were not estimating a heat-wave effect, by comparing heat-wave days with non-heat wave days across different subgroups, but rather associations across different subgroups during heat-wave periods solely.
- When the vulnerability subgroups considered were assessed only once in all of the final set of selected papers without distinguishing ambient temperature and heat-waves studies (e.g. body mass index in Xu et al. <sup>20</sup>, depression in Stafoggia et al. <sup>10</sup>, smoking in Madrigano et al. <sup>21</sup>).
- When subcategories of outcomes, such as cause of death or place of death, were considered as vulnerability factors. We excluded these subgroups as, based on the definition of vulnerability we use, they cannot logically modify the associations between heat and mortality.

In addition, the reference sections of studies identified as described above were searched, and pertinent references not initially identified were thus added. Where published literature reviews on heat-related health effects were cited in these reference lists, we additionally searched their references: the reference lists of eight reviews on temperature effects in children<sup>13,22</sup>, the elderly<sup>3</sup> and general population<sup>4,5,7,8,23</sup> were thus searched by hand.

We separated the articles finally selected into two categories: 1) studies investigating associations of high ambient temperature with mortality and 2) studies investigating associations of heat waves with mortality.

#### *Data extraction*

From the selected studies, we extracted the estimates of association (e.g. RR, IRR or OR) for all the included subpopulations. The estimates were obtained from the published tables, figures (when it was possible to precisely determine the estimates of association from the published material), through text descriptions, supplemental material, and when accessible from the original data. When different lag effects were presented, we systematically used estimates of association between heat and mortality for the shortest lag effects presented. We then documented the location of the studies, their time period, study design, the temperature exposure variable and the following vulnerability factors (see details in supplemental material: Table 1S): i) sex; ii) age: elderly and children; iii) individual and ecological socioeconomic status; iv) urban design and housing: intra-urban heat variations, air conditioning, and population density; v) marital status.

### *Heterogeneity assessment using the Cochran Q test*

To assess whether there was a heterogeneous association with high temperatures between subgroups, we conducted a Cochran Q test (see supplemental material: Appendix 1S for details). We considered the presence of heterogeneity at the 10% level of significance<sup>24,25</sup>. When estimates for all groups combined were not reported, we calculated them as described in the supplemental material (Appendix 1S) (for example, if a study presented estimates for men and women without presenting the estimate for both sexes combined). When analyses were conducted in the same study for different cities or for different time periods (e.g. different heat waves), we assessed the heterogeneity between different subgroups separately; for this reason, the number of strata comparisons is greater than the number of studies finally included. When more than two strata were presented, we compared only the two extreme groups. For example, if the heat associations were presented by quintiles of socioeconomic status (SES), we compared the least deprived group (first quintile) to the most deprived group (fifth quintile). For ethnic groups, we only compared White persons to Black persons or to Non-White persons and we did not include Hispanic persons in the comparisons (as this group was only assessed in one study<sup>26</sup>). In one study<sup>27</sup>, many employment status categories were presented, and we only compared unemployed to white collar.

### *Heterogeneity assessment using a meta-analysis*

In parallel to the heterogeneity assessment described above, we conducted a meta-analysis. We included only high ambient temperature studies. We did not conduct a meta-analysis for heat wave studies since the study designs and methods were not comparable to one another. The minimum number of studies required to conduct a meta-analysis was fixed at 10<sup>28,29</sup>. We considered sex, age (more than 65 and more than 75), and SES (individual and ecological definitions separately) subgroups.

In order to compare subgroups within selected studies, we used the natural logarithm of the ratio of RR values (RRR) (or analogous estimates of association) for the two compared subgroups (e.g.  $RR_{\text{men}}/RR_{\text{women}}$ ) as described by Altman et al.<sup>30</sup> or Bassler et al.<sup>31</sup>. The formula used to calculate the standard errors of the ratios is presented in the Supplemental Material (Appendix 1S). Moreover, for the studies that reported contrast definition by comparing two percentiles of temperature distributions, the highest percentile was always above the 95<sup>th</sup> percentile. We used random-effects models to account for heterogeneity between studies. To assess heterogeneity of the  $\ln(\text{RRR})$ s across individual studies, we used the  $I^2$  statistic ( $I^2 > 50\%$  was used as a threshold)<sup>29,32</sup>. Publication bias was assessed with funnel plots and Egger's regression model<sup>33</sup>.

### *Meta-regression analysis*

To investigate factors associated with the magnitude of the RRR, we performed random effects meta-regression analyses in which the dependent variable was the  $\ln(\text{RRR})$  and independent variables were: study design (i.e. case-crossover or time series), continent (i.e. Europe, America, Asia and Australia) and contrast definition (i.e. percentage increase comparing two percentiles of the temperature distribution or percent changes associated with degree units increases above a city specific threshold) for sex and age  $>65$  years; the continent and the contrast definition for age  $>75$  years; study design, continent, and contrast definition for SES. We also investigated in all meta-regression analysis the separate associations with the following variables: local temperature, using the yearly summer temperature average for single cities, and when multiple cities were assessed simultaneously, the average for all the cities was considered; latitude, creating four groups of latitude positions: i)  $60^\circ\text{N}$  to  $30^\circ\text{N}$ ; ii)  $30^\circ\text{N}$  to equator; iii) equator to  $30^\circ\text{S}$ ; iv)  $30^\circ\text{S}$  to  $60^\circ\text{S}$ ; study period, including the median year of study period (as indicated in Table 1) as indicator of change of heat associations over time.

We conducted a meta-regression for each variable separately. We estimated from these meta-regressions the regression coefficients (betas and 95% CI), the *P* Value, the  $R^2$  statistic (which represents the proportion of between-study variance explained by the covariate), the residual  $I^2$  (which represents after adjustment for the predictors, a measure of the percentage of the residual variation that is attributable to between-study heterogeneity), and the adjusted pooled RRR (and 95% CI).

## Results

### *Selection of studies*

Altogether the abstracts of 299 articles were assessed and 111 underwent in-depth review, with 61 studies fulfilling the inclusion criteria. **Figure 1** presents the inclusion and exclusion of studies. Among the 111 articles retained based on the first exclusion criteria with abstract screening, 43 studies were excluded entirely because they did not report a comparison group. Among them, three studies<sup>34-36</sup> were excluded because they used a case-only design that did not permit the comparison of different subgroups, and seven studies were excluded because they only assessed the spatial variability of heat-related mortality. Eight studies were excluded because they showed variation only according to cities or regions. Among the 61 remaining studies, seven were identified through reference searching. Two studies were excluded because it was impossible to precisely determine the estimates of association from the published material.

### *Description of selected studies*

The characteristics of the included studies are presented in **Table 1** and **Table 2**. All the studies were published between 1998 and 2014. Twenty-four studies were conducted in Europe, 12 in North America, 19 in Asia, seven in Australia, one in Africa, and two studies that assessed multiple regions.

Fortyone studies retained assessed the association of high ambient temperature (**Table 1**) with mortality. Among these studies, 35 used a time-series design and six used a case-crossover design. Various contrast definitions between mortality and high ambient temperature were reported: 27 studies assessed the relationship by reporting percent changes or RR (or IRR) associated with degree unit increases (1°C, 3°C, 10°C, 10°F) above a city-specific threshold, and 14 reported percent increase or RR or odds ratios (OR) comparing two percentiles of temperature distributions.

Twenty of the retained studies assessed the association of heat waves (**Table 2**) with mortality. The definitions were very different from one study to another<sup>3,4</sup> as described in Table 2. Two types of definition have been used: one criterion requires 2 or 3 consecutive days with a specific temperature threshold, whereas the other criterion is based on single days above a temperature threshold. Among these studies, ten used a descriptive design in which observed mortality rates during heat-wave days were compared to mortality rates during non-heat-wave days across different subgroups. Seven studies used a time-series design, and three used a case-crossover design (see **Table 2**). Various contrast definitions between mortality and heat waves were reported. Seven studies reported this relationship by a percent increase on heat wave days compared to non-heat-wave days, and 13 with RR, IRR or excess mortality rates for heat-wave days compared with non-heat-wave days.

### *Heterogeneity findings*

We systematically compared all the included subgroup estimates of association between heat and mortality, separately for high ambient temperature (**Table 3**) and for heat wave studies (**Table 4**). A description of the stratified estimates included in the review is presented in supplemental Table 6S for high ambient temperature studies and Table 7S for heat-waves studies. For studies of the association between high ambient temperature and mortality, we consistently found evidence of vulnerability for one subgroup: populations living in areas characterized by a low percentage of households having central air conditioning. For studies on the association between heat waves and mortality, we consistently found evidence of vulnerability for the following three subgroups: elderly persons above 85 years of age, populations living in hot places, and individuals who were not married (used as a proxy for social isolation<sup>37</sup>). Heterogeneity was not always found for other subgroups studied, such as SES subgroups or children.

Nonetheless when heterogeneity was found from studies on the association between temperature and mortality, the following subgroups were always identified as vulnerable: elderly persons by every age cut-point examined, low individual SES groups, populations living in high density areas, and unmarried individuals. The comparison of heterogeneity findings between high ambient temperature and heat waves studies is presented in Supplemental **Table 2S**.

#### *Meta-analysis results*

We conducted meta-analyses of the  $\ln(\text{RRR})$  for sex, age (more than 65 and more than 75 years) and SES (individual and ecologic separately) only on studies of high ambient temperature. We found that the pooled RRR for male sex was 0.99 (95% CI: 0.97, 1.01) (**Figure 2**). We found that the pooled ratio of RRs for individuals aged > 65 years, compared to adults aged between 15 and 64 years was 1.02 (95% CI: 1.01, 1.03) (**Figure 3**), and that the pooled ratio of RRs for those aged >75 years, compared to adults aged between 15 and 74 years was 1.04 (95% CI: 1.02, 1.07) (**Figure 4**). For SES measured at the individual level, we found that the pooled RRR for low SES compared to high SES groups was 1.03 (95% CI: 1.01, 1.05) (**Figure 5**). For SES measured at the ecologic level, we found that the pooled RRR for low SES compared to high SES groups was 1.01 (95% CI: 0.99, 1.02) (**Figure 6**). Evidence of bias (assessed with Egger's test) was apparent for studies that assessed sex and age > 75 years as vulnerable factors, but not for age > 65 years and SES (see Supplemental Figures 1S to 4S).

#### *Meta-regression results*

The large heterogeneity (all  $I^2 > 50\%$ ) found in the pooled RRR suggests the existence of study characteristics influencing this variability. We conducted meta-regression analyses to assess the influence of different study characteristics on meta-analysis heterogeneity.

Of the study characteristics assessed for articles exploring age > 75 years, only the contrast definition was a significant factor in explaining heterogeneity in the pooled RRR, such that the use of a percentage increase comparing two percentiles of the temperature distribution was associated with a higher vulnerability for the elderly. This suggests that when studies used a percentage increase as the contrast definition they were more likely to find vulnerability differences by age as compared to using the comparison of two percentiles of the temperature distribution. For individual SES studies, contrast definition was also related to the heterogeneity in the pooled RRR. Similarly to older age, the use of a percentage increase as the contrast was associated with higher vulnerability for low individual SES groups. Finally, we did not find that local temperature, latitude or study period were related to the heterogeneity in the pooled RRR in any of the meta-regression conducted (see Tables 5, 6; see supplemental material for sex, aged > 65 years and aged > 75 years). The pooled estimate for the ratios for age > 75 years vs. younger age groups, adjusted for the contrast definition, was 1.11 (95% CI: 1.05, 1.17). The pooled ratio for low vs. high SES measured at the individual level, adjusted for measures of associations, was 1.05 (95% CI: 1.03, 1.07). It is interesting to note that for individual SES, adjustment for the contrast definition decreased the  $I^2$  to 50%, which we define as a low degree of heterogeneity in the pooled RRR. The meta-regression results for individual SES and ecologic SES are respectively presented in **Tables 5** and **6** and other meta-regression results for sex, age > 65 years and > 75 years are presented in Supplemental Tables 3S to 5S.

## **Discussion**

### *Summary of results*

In this systematic review we assessed the published evidence supporting the presence of subgroups vulnerable to heat-related mortality. Using Cochran's Q test we found evidence of particular vulnerability for the most elderly and for populations living in areas characterized by a low percentage of households having central air conditioning. Vulnerability was also noted, in heat wave studies, for populations living in hot places and for unmarried people, and in high ambient temperature studies, for people living in areas with a low percentage of households with central air conditioning, although very few assessments were available. On the other hand, results of the meta-analyses, focusing on high ambient temperature studies only, showed that elderly persons 65+ and 75+ and low individual SES groups were more vulnerable than their respective counterparts using the pooled estimate (RRR).

### *Comparison of the results with current knowledge*

The results of the present study can be compared to factors of vulnerability reported in various institutional guidelines, aimed at informing interventions for the prevention of heat-related mortality such as the WHO heat action plan<sup>38,39</sup>. Heat action plans include heat warning systems during heat waves, plans for emergency measures, as well as actions aimed at reducing high ambient temperatures over the long term (e.g. greening activities).

In the European WHO heat health action plan<sup>38</sup>, the vulnerable subgroups identified are the elderly, infants, and children, people with chronic diseases, people taking particular medications, people with low SES, and people in specific occupations. The identification of elderly people and those from low SES subgroups as being of particular vulnerability is concordant with our results.

Lowe et al.<sup>40</sup>, in assessing the content of 12 European heat health action plans, also reported that in 11 out of 12 plans, the elderly, children, the chronically ill, and those on medication were considered vulnerable subgroups. Thus, it appears that some subgroups identified as vulnerable in both the heat action plans and in guidelines for planning were not assessed, or not reported as having heterogeneous associations with mortality, in the present study. Other reviews addressed heat-related vulnerability. Bouchama et al.<sup>41</sup> conducted a meta-analysis of 6 case-control studies on heat wave-related mortality, and found that both not leaving home daily and having a pre-existing illness were associated with higher risk, while greater social contact and having air conditioning were protective.

#### *Limitations of the review*

This review has some limitations. First, we excluded a number of studies because the statistical heterogeneity test could not be performed.

In epidemiologic studies addressing inequalities in the health effects of heat, such as those included in this review, the relative scale (e.g. risk ratio, incidence rate ratio, odds ratio...) is most often used and the absolute scale (e.g. risk difference, incidence rate difference ...) is generally ignored<sup>42</sup>. However, baseline risks can differ considerably across different subgroups, as for elderly compared to younger adults. Using absolute measures when addressing vulnerabilities reflects not only differences in health impacts across different subgroups, but can be a more useful public health strategy, as risk difference corresponds directly to attributable cases<sup>43,44</sup>. Moreover, absolute measures will often highlight different patterns of inequalities between subgroups than relative measures<sup>43,45</sup>.

We conducted meta-analyses only for high ambient temperature studies to minimize the differences between study designs and methods of analysis.

Still, we found considerable heterogeneity between studies (all  $I^2 > 50\%$ ), which makes complicates the interpretation of a single summary estimate<sup>28,46</sup>. Hence, we conducted meta-regression analyses to investigate factors associated with the magnitude of the RRR, and found that only the inclusion of contrast definition reduced the  $I^2$  estimate to 50% for the individual SES meta-analysis. However, other study-related factors that were not assessed in this review, such as population age and sex structures, presence of local heat action plans or population's resilience facing hot temperatures<sup>7</sup>, could explain some of the residual heterogeneity. We also did not assess the influence of lag effects on modification effects. Yet, mortality displacement could be heterogeneous because of subgroups in different populations. Further studies may address this matter. Finally, it is worth noting that in addition to the previous factors that can affect heterogeneity between studies, the differences between two subgroups within a study's population can impact heterogeneity between studies as well. For instance, the magnitude of socio-economic inequalities can differ widely between two cities over the world, so that the comparison of the lowest to highest groups can reflect completely different degrees of disparity.

We assessed socioeconomic vulnerability to heat, considering together income, education, immigration status, deprivation composite indexes, and other ecologic or individual characteristics, assuming that they represent the comparable measures of social hierarchy.

However, the various individual and/or ecologic socioeconomic measures may not represent the same social dimension<sup>47-50</sup>. For example, education may influence the understanding of preventive messages, while income may limit access to air conditioning.

We considered vulnerability factors independently as assessed in the majority of the studies since many of the factors considered are highly correlated. Yet, when assessing vulnerability according to sex, for example, it is possible that sex differences in age distribution could explain some of this heterogeneity.

Finally, as many vulnerability definitions exist, the one adopted in our study could be disputed<sup>51,52</sup>. We chose an epidemiologic definition (i.e. effect measure modification) to identify factors of vulnerability to heat, but vulnerability can encompass other dimensions beyond this definition, such as the notion of social trajectory<sup>52</sup>. Also, in the literature reviewed in this paper, vulnerability factors were considered separately, but it is reasonable to think that several modifying factors might interact synergistically in the heat-related mortality relationship.

#### *Recommendations for studies on the relationship between heat and death*

We noted some limitations in the selected studies of our review, so here we present recommendations to guide further research on heat-related mortality vulnerability. As noted above, the absolute scale is rarely used in this context; therefore we encourage integrating risk differences in case-crossover designs for example. To do so, we recommend that future studies estimate risk differences directly from logistic regressions. The use of novel inequality measures in time-series analyses is also encouraged, such as use of the Index of Disparity<sup>53</sup>, or simple measurement of differences in daily death counts between two subgroups as outcomes<sup>45,54</sup>.

We excluded both cause of death and place of death as modifying factors as they are subcategories of the mortality outcome. In the studies reviewed, causes of death for instance were used as proxies for existing cardiovascular or respiratory diseases. We argue that this is an inappropriate proxy as these factors are themselves due to heat (i.e. stratification for factors affected by exposure). Even if association estimates across these strata are observed to be heterogeneous, they do not constitute a modifying factor in the same sense. This point should be further explored using appropriately designed studies with prospective data, in which the diagnosis of a pre-existing illness is used, as was undertaken in a recent paper on elderly persons

<sup>55</sup>.

Some effect modifiers were difficult to assess in the present study due to the lack of published examples. These include marital status or living in hot places (e.g. micro heat islands), and could be addressed in the future studies.

We found that contrast definition can influence the heterogeneity between studies. Further studies may assess effect modification using different contrast definitions, as sensitivity analyses.

The causal pathways linking vulnerability factors (i.e. modifying factors) are complex and need further consideration. More effort is needed toward the inclusion of causal inference methods to properly consider the role of measured individual or contextual determinants in the heat-related mortality studies, and their synergic influence. Using directed acyclic graphs can be useful for identifying inappropriate practices in causal structures investigating vulnerable subgroups to heat-related mortality<sup>56,57</sup>, as illustrated with respect to confounding in two recent papers<sup>58,59</sup>. Methodologic developments are also required since the distinction between individual and contextual factors remains unclear, and methods used to date do not permit one to elucidate the association of place characteristics with individual outcomes while accounting for non-independence of observations<sup>60,61</sup>.

### *Conclusions*

While the link between excess heat and mortality is well established, the needed fundamental evidence on heat-vulnerable subgroups remains incomplete. Knowledge about vulnerable subgroups is essential for the success of public health programs<sup>15,16,62</sup>, and is necessary for the application of blended intervention strategies, such as proportionate universalism and targeting within universalism<sup>63,64</sup>. Where specific interventions are planned to reduce health impacts in vulnerable populations or territories, such as adapted campaigns or urban modifications, misclassification of vulnerability status may challenge intervention effectiveness and implementation success.

## References

1. Semenza JC, Rubin CH, Falter KH, Selanikio JD, Flanders WD, Howe HL, Wilhelm JL. Heat-related deaths during the July 1995 heat wave in Chicago. *New England journal of medicine* 1996;**335**(2):84-90.
2. Kovats RS, Kristie LE. Heatwaves and public health in Europe. *The European Journal of Public Health* 2006;**16**(6):592-599.
3. Åström DO, Bertil F, Joacim R. Heat wave impact on morbidity and mortality in the elderly population: a review of recent studies. *Maturitas* 2011;**69**(2):99-105.
4. Basu R. High ambient temperature and mortality: a review of epidemiologic studies from 2001 to 2008. *Environ Health* 2009;**8**(1):40.
5. Basu R, Samet JM. Relation between elevated ambient temperature and mortality: a review of the epidemiologic evidence. *Epidemiologic reviews* 2002;**24**(2):190-202.
6. Gosling SN, Lowe JA, McGregor GR, Pelling M, Malamud BD. Associations between elevated atmospheric temperature and human mortality: a critical review of the literature. *Climatic Change* 2009;**92**(3-4):299-341.
7. Hajat S, Kosatky T. Heat-related mortality: a review and exploration of heterogeneity. *Journal of Epidemiology and Community Health* 2010;**64**(9):753-760.
8. Romero-Lankao P, Qin H, Dickinson K. Urban vulnerability to temperature-related hazards: A meta-analysis and meta-knowledge approach. *Global Environmental Change* 2012;**22**(3):670-683.
9. McMichael AJ. International study of temperature, heat and urban mortality: The "/>ISOTHURM/" project. *Int. J. Epidemiol.* 2008;**37**:1121-1131.
10. Stafoggia M, Forastiere F, Agostini D, Biggeri A, Bisanti L, Cadum E, Caranci N, de'Donato F, De Lisio S, De Maria M. Vulnerability to heat-related mortality: a multicity, population-based, case-crossover analysis. *Epidemiology* 2006;**17**(3):315-323.

11. Kuh D, Ben-Shlomo Y, Lynch J, Hallqvist J, Power C. Life course epidemiology. *Journal of epidemiology and community health* 2003;**57**(10):778.
12. Brook RD, Rajagopalan S, Pope CA, Brook JR, Bhatnagar A, Diez-Roux AV, Holguin F, Hong Y, Luepker RV, Mittleman MA. Particulate matter air pollution and cardiovascular disease an update to the scientific statement from the American Heart Association. *Circulation* 2010;**121**(21):2331-2378.
13. Xu Z, Etzel RA, Su H, Huang C, Guo Y, Tong S. Impact of ambient temperature on children's health: a systematic review. *Environmental research* 2012;**117**:120-131.
14. Sari Kovats R, Menne B, Ebi KL. *Methods of assessing human health vulnerability and public health adaptation to climate change* WHO, 2003.
15. Benach J, Malmusi D, Yasui Y, Martínez JM, Muntaner C. Beyond Rose's strategies: a typology of scenarios of policy impact on population health and health inequalities. *International Journal of Health Services* 2011;**41**(1):1-9.
16. Frohlich KL, Potvin L. Transcending the known in public health practice: the inequality paradox: the population approach and vulnerable populations. *American journal of public health* 2008;**98**(2):216-221.
17. Bassil KL, Cole DC. Effectiveness of public health interventions in reducing morbidity and mortality during heat episodes: a structured review. *International journal of environmental research and public health* 2010;**7**(3):991-1001.
18. Toloo G, FitzGerald G, Aitken P, Verrall K, Tong S. Evaluating the effectiveness of heat warning systems: systematic review of epidemiological evidence. *International journal of public health* 2013;**58**(5):667-681.
19. Moher D, Liberati A, Tetzlaff J, Altman DG. Preferred reporting items for systematic reviews and meta-analyses: the PRISMA statement. *Annals of internal medicine* 2009;**151**(4):264-269.
20. Xu W, Thach T-Q, Chau Y-K, Lai H-K, Lam T-H, Chan W-M, Lee RS, Hedley AJ, Wong C-M. Thermal stress associated mortality risk and effect modification by sex

- and obesity in an elderly cohort of Chinese in Hong Kong. *Environmental Pollution* 2013;**178**:288-293.
21. Madrigano J, Mittleman MA, Baccarelli A, Goldberg R, Melly S, Von Klot S, Schwartz J. Temperature, myocardial infarction, and mortality: Effect modification by individual and area-level characteristics. *Epidemiology (Cambridge, Mass.)* 2013;**24**(3):439.
  22. Xu Z, Sheffield PE, Su H, Wang X, Bi Y, Tong S. The impact of heat waves on children's health: a systematic review. *International journal of biometeorology* 2014;**58**(2):239-247.
  23. Hansen A, Bi L, Saniotis A, Nitschke M. Vulnerability to extreme heat and climate change: is ethnicity a factor? *Global health action* 2013;**6**.
  24. Kaufman JS, MacLehose RF. Which of these things is not like the others? *Cancer* 2013;**119**(24):4216-4222.
  25. Shah AS, Langrish JP, Nair H, McAllister DA, Hunter AL, Donaldson K, Newby DE, Mills NL. Global association of air pollution and heart failure: a systematic review and meta-analysis. *The Lancet* 2013;**382**(9897):1039-1048.
  26. Basu R, Ostro BD. A multicounty analysis identifying the populations vulnerable to mortality associated with high ambient temperature in California. *American journal of epidemiology* 2008;**168**(6):632-637.
  27. Yang J, Ou C-Q, Ding Y, Zhou Y-X, Chen P-Y. Daily temperature and mortality: a study of distributed lag non-linear effect and effect modification in Guangzhou. *Environ Health* 2012;**11**(1):63.
  28. Garg AX, Hackam D, Tonelli M. Systematic review and meta-analysis: when one study is just not enough. *Clinical Journal of the American Society of Nephrology* 2008;**3**(1):253-260.

29. Higgins J, Thompson SG. Quantifying heterogeneity in a meta-analysis. *Statistics in medicine* 2002;**21**(11):1539-1558.
30. Altman DG, Bland JM. Interaction revisited: the difference between two estimates. *Bmj* 2003;**326**(7382):219.
31. Bassler D, Briel M, Montori VM, Lane M, Glasziou P, Zhou Q, Heels-Ansdell D, Walter SD, Guyatt GH, Group S-S. Stopping randomized trials early for benefit and estimation of treatment effects: systematic review and meta-regression analysis. *Jama* 2010;**303**(12):1180-1187.
32. Reid IR, Bolland MJ, Grey A. Effects of vitamin D supplements on bone mineral density: a systematic review and meta-analysis. *The Lancet* 2014;**383**(9912):146-155.
33. Egger M, Smith GD, Schneider M, Minder C. Bias in meta-analysis detected by a simple, graphical test. *Bmj* 1997;**315**(7109):629-634.
34. Kosatsky T, Henderson SB, Pollock SL. Shifts in Mortality During a Hot Weather Event in Vancouver, British Columbia: Rapid Assessment With Case-Only Analysis. *American journal of public health* 2012;**102**(12):2367-2371.
35. Medina-Ramon M, Zanobetti A, Cavanagh D, Schwartz J. Extreme temperatures and mortality: Assessing effect modification by personal characteristics and specific cause of death in a multi-city case-only analysis. *Environ. Health Perspect.* 2006;**114**:1331-1336.
36. Schwartz J. Who is sensitive to extremes of temperature?: A case-only analysis. *Epidemiology* 2005;**16**(1):67-72.
37. Chan EYY, Goggins WB, Kim JJ, Griffiths SM. A study of intracity variation of temperature-related mortality and socioeconomic status among the Chinese population in Hong Kong. *Journal of epidemiology and community health* 2012;**66**(4):322-327.

38. Matthies F, Bickler G, Marín NC, Hales S. *Heat-health action plans: guidance* World Health Organization, 2008.
39. WHO. *Climate change and health*, 2008.
40. Lowe D, Ebi KL, Forsberg B. Heatwave early warning systems and adaptation advice to reduce human health consequences of heatwaves. *International journal of environmental research and public health* 2011;**8**(12):4623-4648.
41. Bouchama A, Dehbi M, Mohamed G, Matthies F, Shoukri M, Menne B. Prognostic factors in heat wave–related deaths: a meta-analysis. *Archives of Internal Medicine* 2007;**167**(20):2170-2176.
42. King NB, Harper S, Young ME. Use of relative and absolute effect measures in reporting health inequalities: structured review. *BMJ* 2012;**345**:e5774.
43. Lynch J, Smith GD, Harper S, Bainbridge K. Explaining the social gradient in coronary heart disease: comparing relative and absolute risk approaches. *Journal of Epidemiology and Community Health* 2006;**60**(5):436-441.
44. Yang S, Platt RW, Dahhou M, Kramer MS. Do population-based interventions widen or narrow socioeconomic inequalities? The case of breastfeeding promotion. *International journal of epidemiology* 2014:dyu051.
45. Harper S, King NB, Meersman SC, Reichman ME, Breen N, Lynch J. Implicit value judgments in the measurement of health inequalities. *Milbank Quarterly* 2010;**88**(1):4-29.
46. Lau J, Ioannidis JP, Schmid CH. Summing up evidence: one answer is not always enough. *The lancet* 1998;**351**(9096):123-127.
47. Braveman PA, Cubbin C, Egerter S, Chideya S, Marchi KS, Metzler M, Posner S. Socioeconomic status in health research: one size does not fit all. *Jama* 2005;**294**(22):2879-2888.
48. Galobardes B, Lynch J, Smith GD. Measuring socioeconomic position in health research. *British Medical Bulletin* 2007;**81**(1):21-37.

49. Oakes JM, Rossi PH. The measurement of SES in health research: current practice and steps toward a new approach. *Social science & medicine* 2003;**56**(4):769-784.
50. Shavers VL. Measurement of socioeconomic status in health disparities research. *Journal of the national medical association* 2007;**99**(9):1013.
51. Alwang J, Siegel PB, Jorgensen SL. Vulnerability: a view from different disciplines. Social protection discussion paper series, 2001.
52. Delor F, Hubert M. Revisiting the concept of 'vulnerability'. *Social Science & Medicine* 2000;**50**(11):1557-1570.
53. Percy JN, Keppel KG. A summary measure of health disparity. *Public health reports* 2002;**117**(3):273.
54. Benmarhnia T, Zunzunegui M-V, Llácer A, Béland F. Impact of the economic crisis on the health of older persons in Spain: research clues based on an analysis of mortality. SESPAS report 2014. *Gaceta Sanitaria* 2014;**28**:137-141.
55. Zanobetti A, O'Neill MS, Gronlund CJ, Schwartz JD. Summer temperature variability and long-term survival among elderly people with chronic disease. *Proceedings of the National Academy of Sciences* 2012;**109**(17):6608-6613.
56. Shrier I, Platt RW. Reducing bias through directed acyclic graphs. *BMC medical research methodology* 2008;**8**(1):70.
57. VanderWeele TJ, Robins JM. Four types of effect modification: A classification based on directed acyclic graphs. *Epidemiology* 2007;**18**(5):561-568.
58. Buckley JP, Samet JM, Richardson DB. Commentary: does air pollution confound studies of temperature? *Epidemiology* 2014;**25**(2):242-245.
59. Reid CE, Snowden JM, Kontgis C, Tager IB. The role of ambient ozone in epidemiologic studies of heat-related mortality. *Environmental health perspectives* 2012;**120**(12):1627.
60. Greenland S. Principles of multilevel modelling. *International journal of epidemiology* 2000;**29**(1):158-167.

61. Næss Ø, Piro FN, Nafstad P, Smith GD, Leyland AH. Air pollution, social deprivation, and mortality: a multilevel cohort study. *Epidemiology* 2007;**18**(6):686-694.
62. Balbus JM, Malina C. Identifying vulnerable subpopulations for climate change health effects in the United States. *Journal of Occupational and Environmental Medicine* 2009;**51**(1):33-37.
63. Lawrence E, Stoker R, Wolman H. The effects of beneficiary targeting on public support for social policies. *Policy Studies Journal* 2013;**41**(2):199-216.
64. Skocpol T. Targeting within universalism: Politically viable policies to combat poverty in the United States. *The urban underclass* 1991;**411**(411):437-59.
65. Almeida S, Casimiro E, Analitis A. Short-term effects of summer temperatures on mortality in Portugal: a time-series analysis. *Journal of Toxicology and Environmental Health, Part A* 2013;**76**(7):422-428.
66. Baccini M, Biggeri A, Accetta G, Kosatsky T, Katsouyanni K, Analitis A, Anderson HR, Bisanti L, D'Ippoliti D, Danova J. Heat effects on mortality in 15 European cities. *Epidemiology* 2008;**19**(5):711-719.
67. Bai L, Woodward A, Liu Q. Temperature and mortality on the roof of the world: A time-series analysis in three Tibetan counties, China. *Science of The Total Environment* 2014;**485**:41-48.
68. Bell ML, O'Neill MS, Ranjit N, Borja-Aburto VH, Cifuentes LA, Gouveia NC. Vulnerability to heat-related mortality in Latin America: a case-crossover study in Sao Paulo, Brazil, Santiago, Chile and Mexico City, Mexico. *International journal of epidemiology* 2008;**37**(4):796-804.
69. Benmarhnia T, Oulhote Y, Petit C, Lapostolle A, Chauvin P, Zmirou-Navier D, Deguen S. Chronic air pollution and social deprivation as modifiers of the association between high temperature and daily mortality. *Environ Heal* 2014;**13**(1):53-60.
70. Breitner S, Wolf K, Devlin RB, Diaz-Sanchez D, Peters A, Schneider A. Short-term effects of air temperature on mortality and effect modification by air pollution in three

- cities of Bavaria, Germany: A time-series analysis. *Science of the Total Environment* 2014;**485**:49-61.
71. Burkart K, Breitner S, Schneider A, Khan MMH, Krämer A, Endlicher W. An analysis of heat effects in different subpopulations of Bangladesh. *International journal of biometeorology* 2014;**58**(2):227-237.
  72. Egondi T, Kyobutungi C, Kovats S, Muindi K, Ettarh R, Rocklöv J. Time-series analysis of weather and mortality patterns in Nairobi's informal settlements. *Global health action* 2012;**5**.
  73. Goggins WB, Chan EY, Ng E, Ren C, Chen L. Effect modification of the association between short-term meteorological factors and mortality by urban heat islands in Hong Kong. *PLoS One* 2012;**7**(6):e38551.
  74. Goggins WB, Ren C, Ng E, Yang C, Chan EY. Effect modification of the association between meteorological variables and mortality by urban climatic conditions in the tropical city of Kaohsiung, Taiwan. *Geospatial health* 2013;**8**(1):37-44.
  75. Gómez-Acebo I, Llorca J, Rodríguez-Cundín P, Dierssen-Sotos T. Extreme temperatures and mortality in the North of Spain. *International journal of public health* 2012;**57**(2):305-313.
  76. Gouveia N, Hajat S, Armstrong B. Socioeconomic differentials in the temperature–mortality relationship in São Paulo, Brazil. *International journal of epidemiology* 2003;**32**(3):390-397.
  77. Hajat S, Armstrong BG, Gouveia N, Wilkinson P. Mortality displacement of heat-related deaths: a comparison of Delhi, Sao Paulo, and London. *Epidemiology* 2005;**16**(5):613-620.
  78. Hajat S, Kovats RS, Lachowycz K. Heat-related and cold-related deaths in England and Wales: who is at risk? *Occupational and environmental medicine* 2007;**64**(2):93-100.

79. Huang J, Wang J, Yu W. The lag effects and vulnerabilities of temperature effects on cardiovascular disease mortality in a subtropical climate zone in China. *International journal of environmental research and public health* 2014;**11**(4):3982-3994.
80. Ishigami A, Hajat S, Kovats RS, Bisanti L, Rognoni M, Russo A, Paldy A. An ecological time-series study of heat-related mortality in three European cities. *Environ Health* 2008;**7**(5):1-7.
81. Kim Y, Joh S. A vulnerability study of the low-income elderly in the context of high temperature and mortality in Seoul, Korea. *Science of the total environment* 2006;**371**(1):82-88.
82. Leone M, D'Ippoliti D, De Sario M, Analitis A, Menne B, Katsouyanni K, De' Donato FK, Basagana X, Salah AB, Casimiro E. A time series study on the effects of heat on mortality and evaluation of heterogeneity into European and Eastern-Southern Mediterranean cities: results of EU CIRCE project. *Environ Health* 2013;**12**:55.
83. Ma W, Yang C, Tan J, Song W, Chen B, Kan H. Modifiers of the temperature–mortality association in Shanghai, China. *International journal of biometeorology* 2012;**56**(1):205-207.
84. Medina-Ramón M, Schwartz J. Temperature, temperature extremes, and mortality: a study of acclimatisation and effect modification in 50 US cities. *Occupational and environmental medicine* 2007;**64**(12):827-833.
85. Muggeo VM, Hajat S. Modelling the non-linear multiple-lag effects of ambient temperature on mortality in Santiago and Palermo: a constrained segmented distributed lag approach. *Occupational and Environmental Medicine* 2009;**66**(9):584-591.
86. O'Neill MS, Zanobetti A, Schwartz J. Modifiers of the temperature and mortality association in seven US cities. *American Journal of Epidemiology* 2003;**157**(12):1074-1082.

87. O'Neill MS, Zanobetti A, Schwartz J. Disparities by race in heat-related mortality in four US cities: the role of air conditioning prevalence. *Journal of Urban Health* 2005;**82**(2):191-197.
88. Rocklöv J, Ebi KL, Forsberg B. Mortality related to temperature and persistent extreme temperatures: a study of cause-specific and age-stratified mortality. *Occupational and environmental medicine* 2010;**68**(7):531-6.
89. Rocklöv J, Forsberg B, Ebi K, Bellander T. Susceptibility to mortality related to temperature and heat and cold wave duration in the population of Stockholm County, Sweden. *Global health action* 2014;**7**.
90. Smargiassi A, Goldberg MS, Plante C, Fournier M, Baudouin Y, Kosatsky T. Variation of daily warm season mortality as a function of micro-urban heat islands. *Journal of epidemiology and community health* 2009;**63**(8):659-664.
91. Son J-Y, Lee J-T, Anderson GB, Bell ML. Vulnerability to temperature-related mortality in Seoul, Korea. *Environmental Research Letters* 2011;**6**(3):034027.
92. Stafoggia M, Forastiere F, Agostini D, Caranci N, De' Donato F, Demaria M, Michelozzi P, Miglio R, Rognoni M, Russo A. Factors affecting in-hospital heat-related mortality: a multi-city case-crossover analysis. *Journal of epidemiology and community health* 2008;**62**(3):209-215.
93. Urban A, Davidkiovová H, Kyselý J. Heat-and cold-stress effects on cardiovascular mortality and morbidity among urban and rural populations in the Czech Republic. *International journal of biometeorology* 2014;**58**(6):1057-1068.
94. Vaneckova P, Beggs PJ, de Dear RJ, McCracken KW. Effect of temperature on mortality during the six warmer months in Sydney, Australia, between 1993 and 2004. *Environmental research* 2008;**108**(3):361-369.
95. Wang C, Chen R, Kuang X, Duan X, Kan H. Temperature and daily mortality in Suzhou, China: a time series analysis. *Science of the Total Environment* 2014;**466**:985-990.

96. Wang L, Tong S, Toloo GS, Yu W. Submicrometer particles and their effects on the association between air temperature and mortality in Brisbane, Australia. *Environmental research* 2014;**128**:70-77.
97. Wu W, Xiao Y, Li G, Zeng W, Lin H, Rutherford S, Xu Y, Luo Y, Xu X, Chu C. Temperature–mortality relationship in four subtropical Chinese cities: a time-series study using a distributed lag non-linear model. *Science of the Total Environment* 2013;**449**:355-362.
98. Yu W, Vaneckova P, Mengersen K, Pan X, Tong S. Is the association between temperature and mortality modified by age, gender and socio-economic status? *Science of the total environment* 2010;**408**(17):3513-3518.
99. Yu W, Mengersen K, Hu W, Guo Y, Pan X, Tong S. Assessing the relationship between global warming and mortality: lag effects of temperature fluctuations by age and mortality categories. *Environmental Pollution* 2011;**159**(7):1789-1793.
100. Anderson BG, Bell ML. Weather-related mortality: how heat, cold, and heat waves affect mortality in the United States. *Epidemiology (Cambridge, Mass.)* 2009;**20**(2):205.
101. Basagana X, Sartini C, Barrera-Gómez J, Dadvand P, Cunillera J, Ostro B, Sunyer J, Medina-Ramón M. Heat waves and cause-specific mortality at all ages. *Epidemiology* 2011;**22**(6):765-772.
102. Borrell C, Marí-Dell’Olmo M, Rodriguez-Sanz M, Garcia-Olalla P, Caylà JA, Benach J, Muntaner C. Socioeconomic position and excess mortality during the heat wave of 2003 in Barcelona. *European journal of epidemiology* 2006;**21**(9):633-640.
103. Fouillet A, Rey G, Laurent F, Pavillon G, Bellec S, Guihenneuc-Jouyaux C, Clavel J, Jouglu E, Hémon D. Excess mortality related to the August 2003 heat wave in France. *International archives of occupational and environmental health* 2006;**80**(1):16-24.
104. Huang W, Kan H, Kovats S. The impact of the 2003 heat wave on mortality in Shanghai, China. *Science of the total environment* 2010;**408**(11):2418-2420.

105. Hutter H-P, Moshammer H, Wallner P, Leitner B, Kundi M. Heatwaves in Vienna: effects on mortality. *Wiener klinische Wochenschrift* 2007;**119**(7-8):223-227.
106. Kysely J, Kim J. Mortality during heat waves in South Korea, 1991 to 2005: How exceptional was the 1994 heat wave? *Climate research* 2009;**38**(2):105.
107. Lan L, Cui G, Yang C, Wang J, Sui C, Xu G, Zhou D, Cheng Y, Guo Y, Li T. Increased mortality during the 2010 heat wave in Harbin, China. *EcoHealth* 2012;**9**(3):310-314.
108. Nitschke M, Tucker G, Bi P. Morbidity and mortality during heatwaves in metropolitan Adelaide. *Medical journal of Australia* 2007;**187**(11-12):662-665.
109. Nitschke M, Tucker GR, Hansen AL, Williams S, Zhang Y, Bi P. Impact of two recent extreme heat episodes on morbidity and mortality in Adelaide, South Australia: a case-series analysis. *Environ Health* 2011;**10**(1):42.
110. Rey G, Fouillet A, Bessemoulin P, Frayssinet P, Dufour A, Jouglu E, Hémon D. Heat exposure and socio-economic vulnerability as synergistic factors in heat-wave-related mortality. *European journal of epidemiology* 2009;**24**(9):495-502.
111. Robine J-M, Michel J-P, Herrmann F. Excess male mortality and age-specific mortality trajectories under different mortality conditions: a lesson from the heat wave of summer 2003. *Mechanisms of ageing and development* 2012;**133**(6):378-386.
112. Rooney C, McMichael AJ, Kovats RS, Coleman MP. Excess mortality in England and Wales, and in Greater London, during the 1995 heatwave. *Journal of epidemiology and community health* 1998;**52**(8):482-486.
113. Schifano P, Cappai G, De Sario M, Michelozzi P, Marino C, Bargagli AM, Perucci CA. Susceptibility to heat wave-related mortality: a follow-up study of a cohort of elderly in Rome. *Environ Health* 2009;**8**(50):1-14.
114. Son J-Y, Lee J-T, Anderson G, Bell ML. The impact of heat waves on mortality in seven major cities in Korea. *Environmental health perspectives* 2012;**120**(4):566-571.
115. Tian Z, Li S, Zhang J, Guo Y. The characteristic of heat wave effects on coronary heart disease mortality in Beijing, China: a time series study. *PloS one* 2013;**8**(9):e77321.

116. Tong S, Wang XY, Yu W, Chen D, Wang X. The impact of heatwaves on mortality in Australia: a multicity study. *BMJ open* 2014;**4**(2):e003579.
117. Xu Y, Dadvand P, Barrera-Gómez J, Sartini C, Marí-Dell'Olmo M, Borrell C, Medina-Ramón M, Sunyer J, Basagaña X. Differences on the effect of heat waves on mortality by sociodemographic and urban landscape characteristics. *Journal of epidemiology and community health* 2013;**67**(6):519-525.

## Figure Legends

**Figure 1:** Flowchart outlining study selection. NB: 2 studies <sup>89, 100</sup> investigated both ambient temperature and heat waves.

**Figure 2:** Meta-analysis of the ratio of the RRs according to sex ( $RR_{\text{men}}/RR_{\text{women}}$ ); ES: Effect Size; n=39 studies

**Figure 3:** Meta-analysis of the ratio of the RRs according to age 65+ (individuals aged > 65 years, compared to adults aged between 15 and 64 years) ( $RR_{65+}/RR_{15-64}$ ); ES: Effect Size; n=39 studies

**Figure 4:** Meta-analysis of the ratio of the RRs according to age 75+ (individuals aged > 75 years, compared to adults aged between 15 and 74 years) ( $RR_{75+}/RR_{15-74}$ ); ES: Effect Size; n=13 studies

**Figure 5:** Meta-analysis of the ratio of the RRs according to individual SES ( $RR_{\text{lowSES}}/RR_{\text{highSES}}$ ); ES: Effect Size; n=15 studies

**Figure 6:** Meta-analysis of the ratio of the RRs according to ecologic SES ( $RR_{\text{lowSES}}/RR_{\text{highSES}}$ ); ES: Effect Size; n=12 studies