

Impact of Meteorological Parameters on Suicide Mortality Rates: a case-crossover analysis in Southern Germany (1990 – 2006)

Alexandra Schneider^a, Regina Hampel^a, Karl-Heinz Ladwig^{a,b}, Jens Baumert^a, Karoline Lukaschek^a, Annette Peters^{a,c}, Susanne Breitner^{a,c}

^aInstitute of Epidemiology, Helmholtz Zentrum München - German Research Center for Environmental Health (GmbH), Ingolstädter Landstraße 1, 85764 Neuherberg, Germany

^bDepartment for Psychosomatic Medicine and Psychotherapy, Klinikum rechts der Isar, Munich, Germany

^cChair of Epidemiology, Institute for Medical Information Processing, Biometry and Epidemiology, Ludwig-Maximilians-Universität München, München, Germany

Corresponding author:

Susanne Breitner

Helmholtz Zentrum München, German Research Center for Environmental Health (GmbH)

Ingolstädter Landstraße 1

85764 Neuherberg, Germany

Tel.: +49 89 3187 4481

Fax: + 49 89 3187 3380

Email: susanne.breitner@helmholtz-muenchen.de

Abstract

Background. There is evidence for a seasonal pattern of suicides with peaks in spring and early summer; however, only a limited number of studies has investigated whether daily changes in meteorological variables may trigger suicides.

Methods. Daily fatal suicide (N=10,595) and meteorological data were available for four Bavarian cities and ten counties (Germany) for 1990-2006. City/county-specific immediate, delayed and cumulative effects of air temperature, sunshine duration, and cloud cover on suicides were analyzed using a time-stratified case-crossover approach; city/county-specific effects were then combined using random effects meta-analysis. Potential effect modifiers were specific weather conditions, personal or regional characteristics, and season.

Results. A 5°C increase in air temperature on the day before a suicide compared to the control days was associated with a 5.7% (95% confidence interval (CI): 0.6; 11.0) higher suicide risk. Further, the suicide risk was 6.5% (95% CI: 0.2; 13.3) higher on days with low/medium cloud cover (0-6 oktas) compared to days with high cloud cover (7-8 oktas). While daily changes in temperature were not associated with suicides in spring, we found a higher suicide risk in summer, autumn, and winter in association with temperature increases. The effects of cloud cover were strongest in summer and autumn and on days with temperature above the median (>8.8°C). Sunshine duration was not associated with suicides.

Conclusion. We found a higher risk for suicides in association with short-term increases in air temperature on the day before the event compared to the control days and on days with low to medium cloud cover. This may highlight times when people are more likely to commit suicide.

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1 **1. Introduction**

2 Suicides are considered as a “public health problem of global importance” (Turecki and Brent 2016).
3 Although suicide rates in Germany decreased during the last decades, suicide is still among the leading
4 causes of unnatural deaths (Lukaschek et al. 2012; Robert Koch Institut 2015): 10,078 people
5 committed suicide in 2015 reflecting 12.3 suicides per 100,000 inhabitants and 1.2% of all deaths. In
6 comparison, only 3,459 people died in traffic accidents (4.2 deaths per 100,000 inhabitants)
7 (www.destatis.de).

8 There are several well-known risk factors for suicidal behavior, including psychiatric disorders (Crump
9 et al. 2014; Hawton and van Heeringen 2009), male sex (Moller-Leimkuhler 2003) and older age (>60
10 years) (Fassberg et al. 2012). Other health-related factors associated with suicide are comorbid
11 medical conditions (Qin et al. 2014), chronic pain (Tang and Crane 2006) and sleeping impairments
12 (McCall and Black 2013; Nadorff et al. 2013). Lifestyle and socio-demographic factors have also been
13 linked to an increased suicide risk: negative life events (O'Connor and Nock 2014), social isolation
14 (Turecki and Brent 2016), living alone (Schneider et al. 2014), poverty (Whitley et al. 1999),
15 unemployment (DeFina and Hannon 2015), job-strain (Baumert et al. 2014), family history of suicide
16 (O'Connor and Nock 2014) as well as behavioral risk factors such as excessive smoking and alcohol
17 consumption (Schneider et al. 2011; Tanskanen et al. 2000). Beside these classic risk factors, a seasonal
18 pattern of suicides with peaks in late spring and early summer and a modest second peak in autumn
19 have been observed (Ajdacic-Gross et al. 2010; Christodoulou et al. 2012; Erazo et al. 2004). One
20 potential explanation for this observation could be an association between climate factors such as air
21 temperature or sunlight duration and suicide. However, since season or month of the year are only
22 rough markers of meteorological conditions, investigating seasonal patterns of suicidal behavior can
23 give only an idea of the association between weather conditions and suicides. Studies investigating
24 the effects of daily variations in air temperature on the risk of committing suicide overall found a
25 positive association (Dixon and Kalkstein 2018; Gao et al. 2019; Kim et al. 2016; Kim et al. 2019;

26 Thompson et al. 2018). Studies exploring the effects of other meteorological variables such as
27 sunshine duration or cloud cover show less consistent results. While studies in different European
28 countries reported a positive correlation/association between sunshine duration and suicide mortality
29 (Papadopoulos et al. 2005; Vissoky et al. 2014), Kim et al. (2016) found no association in East Asian
30 countries.

31 So far, there are only few studies examining the relation between suicide and weather-conditions in
32 Central Europe. Therefore, we aimed to investigate the association between short-term changes of
33 air temperature, sunshine duration or cloud cover and fatal suicides in Bavaria, Germany, for the
34 period 1990-2006. We further explored potential effect modifications by specific weather conditions,
35 personal or regional characteristics, and season.

36

37 **2. Materials and Methods**

38 2.1 Suicide data

39 Mortality data were obtained from the Bavarian State Office for Statistics and Data Processing for four
40 Bavarian cities (München, Nürnberg, Augsburg, and Rosenheim) as well as for eleven Bavarian
41 counties (München, Fürstentum, Garmisch-Partenkirchen, Weilheim-Schongau, Bad Tölz-
42 Wolfratshausen, Miesbach, Rosenheim, Berchtesgadener Land, Traunstein, Augsburg, and Aichach-
43 Friedberg) from 1990 to 2006 (Supplemental Figure 1). We used International Classification of
44 Diseases 9th version (ICD-9: E950-E958) codes for the period 1990–1997 and International Statistical
45 Classification of Diseases and Related Health Problems 10th Revision (ICD-10: X60-X84) codes for the
46 years 1998–2006. We did not distinguish between violent (e.g. hanging, firearms) and non-violent (e.g.
47 poisoning) cases in our analyses, as nonviolent suicides were quite rare during our study period (2,057
48 cases in 17 years).

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51 2.2 Meteorological data

52 We obtained meteorological data from the German Weather Service (DWD) and included daily
53 measurements of mean air temperature, mean relative humidity, mean cloud cover, sum of sunshine
54 duration, and sum of precipitation. Cloud cover was the only categorical variable coded in oktas (0 -
55 no clouds to 8 - completely overcast). Continuous measurements of meteorological data throughout
56 the whole study period were available for seven stations, which were located in seven different cities
57 and counties (Supplemental Figure 1). If no sufficient meteorological data were available for a county,
58 data from an adjacent county was assigned to the respective county. Suicide data from Weilheim-
59 Schongau had to be excluded because no meteorological data were available for this county and data
60 from adjacent counties could not be appropriately used due to the large distance. Hence, data of ten
61 Bavarian counties and four cities were included in all further analyses. Barometric pressure was only
62 measured at four of the seven selected stations and, therefore, not considered for analyses.
63 We additionally calculated dew point temperature based on air temperature and relative humidity
64 (Kalkstein and Valimont 1986). For a more detailed description see the Supplemental Table 1.

65

66 2.3 Statistical analyses

67 2.3.1 Effects of meteorological variables

68 City/county-specific associations between meteorological variables and suicides were analyzed using
69 a time-stratified case-crossover approach and conditional logistic regression models (Levy et al. 2001;
70 Maclure 1991). This approach is generally recommended when studying short-term exposures that
71 cause a transient change in risk of a rare event. For each suicide (case day), we selected control days
72 which were falling on the same day of the week within the same month and year as the case day.
73 Because case days and their matched control days are derived from the same person, and a
74 conditional analysis was conducted, non-time-varying confounders (such as underlying medical
75 conditions), time trends, and season, are controlled by design.

76 Meteorological variables may have a non-linear association with suicides. Therefore, each continuous
77 variable was included linearly or as penalized spline (P-Spline) in the model for each outcome
78 separately. Deviation from linearity was assessed based on likelihood ratio tests. All variables showed
79 linear associations with suicides (see, for example, the exposure-response-relationship for air
80 temperature and suicides in Supplemental Figure 2); therefore, they were included linearly in all
81 models described below.

82 When investigating the effects of air temperature, we adjusted the models for long-term time trend,
83 precipitation and cloud cover; models assessing sunshine duration or cloud cover were adjusted for
84 long-term time trend, air temperature and precipitation. Because of the low frequencies of lower
85 categories and to simplify the statistical analyses, we grouped cloud cover into three categories (0-3,
86 4-6, and 7-8 oktas).

87 For each meteorological variable immediate (lag 0), lagged (1 to 4 days before the event) and
88 cumulative effects (5-day average of lag 0 to lag 4) on suicides were analyzed separately. For cloud
89 cover, we did not consider the 5-day average for analysis, as an average of a categorical variable
90 cannot be meaningfully calculated. Each exposure variable and the other meteorological variables
91 were always included with the same lag.

92 In a second stage, we combined city- and county-specific effects estimates using random effects meta-
93 analysis; city- and county-specific exposure-response functions were combined through a multivariate
94 meta-analysis framework as proposed by Gasparrini and colleagues (Gasparrini et al. 2012).

95 Effects are shown as percent risk increase for an increase of 5°C in temperature, and 60min in sunshine
96 duration. Highest cloud cover (7-8 oktas) was chosen as reference category when presenting the
97 associations between cloud cover and suicides.

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101 2.3.2 Effect modifications

102 In further analyses, we explored the following potential effect modifications: i) age (<65 years or ≥ 65
103 years); ii) sex (male or female); iii) place of residence (urban or rural), iv) season (spring: March-May,
104 summer: June-August, autumn: September-November, or winter: December-February); or v) specific
105 meteorological conditions (temperature<median value or ≥median value; relative humidity<median
106 value or ≥median value) modified the associations between meteorological variables and suicides.
107 Effect modifications were analyzed by including interaction terms as well as the main effects of these
108 two variables in the models.

109

110 2.3.3 Sensitivity analyses

111 In order to check the robustness of our results we performed several sensitivity analyses: i) We
112 included trend as a P-Spline; ii) all models were only adjusted for time trend; iii) instead of adjusting
113 for cloud cover, the models were adjusted for sunshine duration; iv) we investigated the effects of
114 dew point temperature as this parameter combines air temperature and relative humidity and might
115 be a better marker for the perceived temperature than air temperature alone; v) we calculated
116 polynomial distributed lag (PDL) models, which include all temperature lags simultaneously. In order
117 to avoid multicollinearity, we used an Almon distributed lag model (Almon 1965) which forces
118 estimates to a polynomial shape. The sum of the lagged temperature effects resulting from a PDL
119 model were compared with the effect of the 5-day temperature average; and vi) we analyzed the
120 association of meteorological variables on suicides and undetermined cases (ICD-9: E980-E989, ICD-
121 10: Y10-Y34, Y89) combined as it is assumed that most of the undetermined deaths are probably
122 suicides (Ohberg and Lonnqvist 1998).

123 All analyses were performed using SAS V9.3 (SAS Institute Inc) and R Statistical Software version 3.1.1
124 (R Development Core Team 2008).

125

126 **3. Results**

127 3.1 Suicide data and meteorological data

128 During the study period (1990-2006), a total of 10,595 fatal suicides were documented. This is
129 equivalent to 1.71 cases per day (see Table 1). 69% of the suicides were committed by men, and almost
130 74% of suicide cases were younger than 65 years.

131 Overall, the number of suicides per 100,000 inhabitants decreased during the study period from a
132 maximum 19.1 cases per 100,000 inhabitants in 1992 to 14.6 cases per 100,000 inhabitants in 2006
133 (Figure 1). Looking at the monthly distributions, we found the highest number of cases per 100,000
134 inhabitants from March to July (range: 1.45-1.55) and decreasing numbers from August to December.
135 Table 1 shows a description of the meteorological variables combining the data of the seven selected
136 measurement stations (each 6,209 days). A description of the variables for each station separately can
137 be found in the Supplemental Material (Supplemental Table 2). For all measurement stations, no or a
138 very low percentage (<0.2%) of days with missing values were observed. Only cloud cover was not
139 measured at one station (Garmisch-Partenkirchen). These missing values were replaced by the
140 rounded average of two measurement stations within the same county. Low (0-3 oktas), medium (4-
141 6 oktas), and high cloud cover (7-8 oktas) was observed for 26%, 34%, and 40% of the measurements,
142 respectively.

143

144 3.2 Meteorological variables and suicides

145 An increase in daily air temperature by 5°C on the day before a suicide compared to the control days
146 was associated with a percent change in suicide risk of 5.7% (95%-CI: 0.6; 11.0) (Figure 2). We found
147 a similar association for the 5-day average of temperature (percent change of 5.2% (95%-CI: -1.1;
148 11.9)), although the effect was not significant.

149 As the effects of low (0-3 oktas) and medium cloud cover (4-6 oktas) were very similar we combined
150 these two categories. On days with cloud cover between 0-6 oktas (lag 0) the suicide risk was 6.5%
151 (95%-CI: 0.2; 13.3) higher compared to days with high cloud cover (7-8 oktas) (Figure 2).

152 City- or county-specific estimates for air temperature with a lag of one day are shown in Figure 3.
153 While we found a moderate heterogeneity (percentage of variation between effect estimates due to
154 heterogeneity rather than chance, $I^2=54.18\%$) between the city-/county-specific temperature effects,
155 the effects of cloud cover did not differ significantly between the study regions.

156

157 3.3 Effect modifications

158 To reduce the number of performed interaction analyses, we only inspected the lag of each
159 meteorological variable with the strongest significant main effect on suicides. We observed a stronger
160 association between temperature (lag 1) and suicide risk in individuals ≥ 65 years (percent change of
161 9.0% (95%-CI: 3.4; 15.0), Figure 4) compared to younger individuals (3.5% (95%-CI: -1.4; 8.7)). The
162 temperature effect was also slightly more pronounced in men (5.9% (95%-CI: 1.5; 10.5)); however, the
163 association did not significantly differ from the effect for women (3.6% (95%-CI: -3.3; 10.9)). While
164 temperature increases in spring were not associated with suicides, we found positive associations in
165 summer (6.7% (95%-CI: 0.3; 13.6)), autumn (4.4% (95%-CI: -1.9; 11.2)), and winter (11.7% (95%-CI: 3.5;
166 20.5)).

167 Low/medium cloud cover (lag 0) was associated with a 12.9% (95%-CI: 1.9; 25.0) and 9.8% (95%-CI:
168 0.0; 20.5) higher suicide risk in summer and autumn, respectively; no effects of cloud cover were found
169 in winter and spring. Moreover, the association between cloud cover and suicides was stronger on
170 days with temperature $\geq 8.8^\circ\text{C}$ (8.9% (95%-CI: 1.6; 16.7)). Stronger effects of low cloud cover on
171 warmer days probably reflect our finding of stronger effects in summer and autumn.

172

173

174 3.4 Sensitivity analyses

175 Changing the adjustment of our models did not lead to substantial changes of the associations
176 between meteorological variables and suicides. The immediate effect of cloud cover became
177 insignificant when adjusting for sunshine duration. However, this is probably due to the close relation
178 of these two variables. Because of the very high correlation between air temperature and dew point
179 temperature (Spearman correlation coefficient of 0.95), the temperature variables showed very
180 similar associations with suicides. The sum of the lagged temperature effects (5.6% (95%-CI: 0.5; 11.0))
181 resulting from PDL analyses were comparable to the effects of the 5-day temperature average on total
182 suicides. There were no essential differences observed when comparing the effects of meteorological
183 variables on suicides or the sum of suicides and undetermined cases because of the very low number
184 of undetermined cases.

185

186 **4. Discussion**

187 4.1 Summary

188 This is one of the first studies investigating the associations between daily changes in meteorological
189 variables and fatal suicides in Central Europe. We found a rather immediate increase in suicides
190 associated with increases in air temperature on the day before the event compared to the control
191 days and with low to medium cloud cover. While temperature was not associated with suicides in
192 spring, we found positive associations in summer, autumn, and winter. Temperature effects were
193 more pronounced in the elderly. The effects of cloud cover were strongest in summer and autumn
194 and on days with temperature above median ($>8.8^{\circ}\text{C}$).

195

196 4.2 Weather and suicides

197 So far, the number of studies investigating the association between daily meteorological changes and
198 daily suicide counts is still limited, especially in Central Europe. Although adjusting for seasonality,

199 most studies found a higher suicide risk in association with increases in air temperature from day to
200 day (Dixon and Kalkstein 2018; Gao et al. 2019; Hiltunen et al. 2014; Kim et al. 2016; Kim et al., 2019;
201 Thompson et al. 2018). A recent systematic review and meta-analysis reported a 1% increase in the
202 incidence of suicide (Incidence Rate Ratio (IRR) = 1.01; 95%-CI: 1.00–1.02; $p < 0.05$) per each 1°C
203 increase in temperature (Gao et al. 2019), which is comparable to our findings. This temperature-
204 suicide association was mainly driven by studies using daily temperatures (Gao et al. 2019). In
205 accordance with our findings, a recent study conducted in three East Asian countries found the
206 strongest temperature effects with a delay of one day also using a time-stratified case-crossover
207 method (Kim et al. 2016). Moreover, we found an increased suicide risk on days with low to medium
208 cloud cover (0 – 6 oktas) compared to days with high cloud cover (7 or 8 oktas), but no associations
209 with sunshine duration. Studies on sunshine duration are inconsistent (Kim et al. 2016; Likhvar et al.
210 2011; Salib 1997; Vissoky et al. 2014). Some studies (Jee et al. 2017; Müller et al. 2011; Papadopoulos
211 et al. 2005) also found a positive association between solar radiation and suicides which might be a
212 surrogate for sunshine duration or cloud cover. We can only speculate why we did not find an
213 association between sunshine duration and suicides but with cloud cover although these two
214 meteorological variables are closely related. A reason might be the measurement accuracy of sunshine
215 duration in our study; another reason might be that cloud cover might act as a surrogate for a different
216 (unmeasured) variable.

217

218 4.3 Susceptible subgroups and season

219 In our study, temperature effects were more pronounced in individuals older than 65 years and were
220 slightly stronger in men. Similar findings were also observed in a study conducted in South Korea (Kim
221 et al. 2011). A further study using data of 15 East Asian cities (Kim et al. 2016) found stronger effects
222 in men but could not find a consistent effect modification by age. It is assumed that the elderly are

223 more susceptible to heat (Hansen et al. 2011) and it has been shown that they commit suicide at a
224 higher rate than any other age group (Stanley et al. 2016).

225 Kim et al. (2011) hypothesized that men more often have outdoor jobs than women and therefore can
226 less avoid stress due to temperature. It has also been reported that women are more able to control
227 their skin temperature than men (Violani and Lombardo 2003). Therefore, our finding of (slightly)
228 stronger temperature effects in men might be reasonable. Moreover, women more frequently
229 attempt suicides rather than actually commit it, whereas men are more likely to complete suicides
230 and choose more violent suicide methods (Mergl et al. 2015). In our study, only 31% of the suicides
231 were committed by women. Therefore, the absence of significant temperature effects in women
232 might only be due to a lack of power.

233 In our study, temperature effects were positive in summer, autumn and winter. We did not find
234 temperature effects in spring although suicide rates were comparably high, which is contrary to
235 previous studies (Hiltunen et al. 2014; Holopainen et al. 2013). These studies hypothesized that
236 increasing thermal stress on warm days after cold nights during spring may over-activate brown
237 adipose tissue and impair heat tolerance. This impairment then may lead to a change in neural activity
238 in the brain areas receiving projections from brown adipose tissue and thereby may increase the risk
239 of suicide (Holopainen et al. 2013). We can only speculate that changes in temperature did not add
240 much to the per se higher suicide risk in spring. Our results also show that not only increases in daily
241 air temperature during summer might be associated with suicides but also short-term increases in
242 temperature during colder time periods (winter). However, for cloud cover we found increased suicide
243 risks in spring, summer, as well as autumn and on days with an average temperature above the median
244 (8.8°C) but no significant effects in winter.

245

246 4.4 Potential mechanisms

247 Several mechanisms linking air temperature and sunshine to suicides have been discussed so far,
248 including neurobiological, sociological and cultural pathways.

249 Among neurobiological mechanisms, the serotonergic system has been shown to have a major role in
250 suicidal behavior (Sadkowski et al. 2013). Among others, abnormalities in serotonin transportation
251 and in serotonin levels in key brain areas have all been linked with suicide (Mann 2013). Studies have
252 observed that ambient temperature can modulate serotonin function. For example, a recent study
253 from Finland showed that higher ambient air temperature is associated with changes in serotonin
254 transporter density that, in turn, increases impulsivity and irritability (Tiihonen et al. 2017). Moreover,
255 it has been shown that low as well as high levels of melatonin are associated with suicidal ideas and
256 depressive disorders. It is assumed that low melatonin levels in depressives are correlated with low
257 serotonin levels in the brain (Srinivasan et al. 2006). This leads to the paradox that sunshine can
258 ameliorate depression but might also be a trigger for suicides (Papadopoulos et al. 2005). At first,
259 sunshine improves the motivation and the usual lack of energy is withdrawn. This extra energy can
260 potentially motivate a depressive person to carry out suicide. An improvement in mood and a
261 protection against suicidal thoughts is expected only on a long-term basis. This hypothesis was
262 supported by Page et al. (2007) who found no seasonal association in a large dataset of suicides in
263 England and Wales but very clear immediate effects of increased temperatures.

264 Regarding sociological factors, one possible mechanism is the use of excess alcohol on hot days (Page
265 et al. 2007); alcohol can exert effects on health through depression of the central nervous system, and
266 by causing diuresis and dehydration (Keatinge 2003). Unfortunately, information on population
267 alcohol consumption was not available for our study, so we cannot comment further on this potential
268 mechanism. Cultural pathways include increased stress from the upcoming school year, or - in areas
269 that are more rural - stress from the approaching harvest season or an increased accessibility to
270 potentially harmful resources (Dixon and Kalkstein 2018).

271

272 4.5 Strengths and limitations

273 A main strength of our study is the availability of daily suicide and meteorological data allowing the
274 application of sophisticated statistical models. So far, only a few short-term studies used modern time-
275 series approaches with the possibility to appropriately adjust for other meteorological variables and
276 long-term time trend (Kim et al. 2011; Kim et al. 2016; Likhvar et al. 2011; Page et al. 2007).
277 Information on sex and age allowed us to investigate potential effect modifications.

278 Complete meteorological data were only available for seven counties. By assigning meteorological
279 data from other counties to a county with no or only incomplete data, we cannot rule out exposure
280 misclassification. However, meteorological variables showed a very high correlation between the
281 different measurement stations. When investigating short-term effects of exposure variables on a
282 health outcome the correct specification of the day-to-day variability is of greater importance than
283 correct absolute exposure levels. Therefore, we assume that exposure misclassification is a rather
284 small problem in our study.

285 Data were only available for a small part of Germany. Therefore, the generalizability of our results is
286 questionable. However, despite the small study area we were able to include a large number of suicide
287 cases (>10,000) during a long study period (17 years) in our analyses and the results indicated no or
288 only a moderate heterogeneity between the city/county-specific effects of meteorological variables.
289 Therefore, we assume that similar associations could be observed for whole Germany.

290 Certain individuals may be genetically predisposed to chemical imbalances or challenging situation
291 such as remaining in debt traps; therefore, we cannot rule out the induction of chemical imbalances
292 over time. If this would be the case, the model assumptions used in this paper might ignore
293 autocorrelated errors that changing financial/economic conditions in Bavaria may have induced over
294 years (perhaps resulting in declining suicide rates).

295

296 **5. Conclusion**

297 We found a higher risk for suicides in association with short-term increases in air temperature on the
298 day before the event compared to the control days and on days with low to medium cloud cover. This
299 may highlight time periods when people are more likely to commit suicide. Gaining knowledge about
300 triggers or predictive factors of these tragic events is important to help clinicians and therapists to
301 advise potential victims as well as friends and relatives in order to improve suicide prevention.

302

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310

311 **Declarations of interest**

312 none

313 **References**

- 314 Ajdacic-Gross V, Bopp M, Ring M, Gutzwiller F, Rossler W. 2010. Seasonality in suicide--a review and
315 search of new concepts for explaining the heterogeneous phenomena. *Soc Sci Med* 71:657-
316 666.
- 317 Almon S. 1965. The distributed lag between capital appropriations and expenditures. *Econometrica*
318 33:178-196.
- 319 Baumert J, Schneider B, Lukaschek K, Emeny RT, Meisinger C, Erazo N, et al. 2014. Adverse conditions
320 at the workplace are associated with increased suicide risk. *J Psychiat Res* 57:90-95.
- 321 Christodoulou C, Douzenis A, Papadopoulos FC, Papadopoulou A, Bouras G, Gournellis R, et al. 2012.
322 Suicide and seasonality. *Acta Psychiat Scand* 125:127-146.
- 323 Crump C, Sundquist K, Sundquist J, Winkleby MA. 2014. Sociodemographic, psychiatric and somatic
324 risk factors for suicide: A Swedish national cohort study. *Psychol Med* 44:279-289.
- 325 DeFina R, Hannon L. 2015. The changing relationship between unemployment and suicide. *Suicide*
326 *Life-Threat* 45:217-229.
- 327 Dixon PG, Kalkstein AJ. 2018. Where are weather-suicide associations valid? An examination of nine
328 US counties with varying seasonality. *Int J Biometeorol* 62:685-697.

329 Erazo N, Baumert J, Ladwig KH. 2004. Sex-specific time patterns of suicidal acts on the German railway
330 system. *An analysis of 4003 cases. J Affect Disord* 83:1-9.

331 Fassberg MM, van Orden KA, Duberstein P, Erlangsen A, Lapierre S, Bodner E, et al. 2012. A systematic
332 review of social factors and suicidal behavior in older adulthood. *Int J Environ Res Public*
333 *Health* 9:722-745.

334 Gao J, Cheng Q, Duan J, Xu Z, Bai L, Zhang Y, et al. 2019. Ambient temperature, sunlight duration, and
335 suicide: A systematic review and meta-analysis. *Sci Total Environ* 646:1021-1029.

336 Gasparrini A, Armstrong B, Kenward MG. 2012. Multivariate meta-analysis for non-linear and other
337 multi-parameter associations. *Stat Med* 31:3821-3839.

338 Hansen A, Bi P, Nitschke M, Pisaniello D, Newbury J, Kitson A. 2011. Older persons and heat-
339 susceptibility: The role of health promotion in a changing climate. *Health Promot J Aust* 22
340 Spec No:S17-20.

341 Hawton K, van Heeringen K. 2009. Suicide. *Lancet* 373:1372-1381.

342 Hiltunen L, Haukka J, Ruuhela R, Suominen K, Partonen T. 2014. Local daily temperatures, thermal
343 seasons, and suicide rates in Finland from 1974 to 2010. *Environ Health Prev Med* 19:286-294.

344 Holopainen J, Helama S, Bjorkenstam C, Partonen T. 2013. Variation and seasonal patterns of suicide
345 mortality in Finland and Sweden since the 1750s. *Environ Health Prev Med* 18:494-501.

346 Jee HJ, Cho CH, Lee YJ, Choi N, An H, Lee HJ. 2017. Solar radiation increases suicide rate after adjusting
347 for other climate factors in South Korea. *Acta Psychiatr Scand* 135:219-227.

348 Kalkstein LS, Valimont KM. 1986. An evaluation of summer discomfort in the United States using a
349 relative climatological index. *American Meteorological Society* 67:842-848.

350 Keatinge WR. 2003. Death in heat waves. *BMJ* 327:512-513.

351 Kim Y, Kim H, Kim DS. 2011. Association between daily environmental temperature and suicide
352 mortality in Korea (2001-2005). *Psychiatry Res* 186:390-396.

353 Kim Y, Kim H, Honda Y, Guo YL, Chen BY, Woo JM, et al. 2016. Suicide and ambient temperature in
354 East Asian countries: A time-stratified case-crossover analysis. *Environ Health Perspect*
355 124:75-80.

356 Kim Y, Kim H, Gasparrini A, Armstrong B, Honda Y, Chung Y, et al. 2019. Suicide and Ambient
357 Temperature: A Multi-Country Multi-City Study. *Environ Health Perspect* 127(11):117007.

358 Levy D, Lumley T, Sheppard L, Kaufman J, Checkoway H. 2001. Referent selection in case-crossover
359 analyses of acute health effects of air pollution. *Epidemiology* 12:186-192.

360 Likhvar V, Honda Y, Ono M. 2011. Relation between temperature and suicide mortality in Japan in the
361 presence of other confounding factors using time-series analysis with a semiparametric
362 approach. *Environ Health Prev Med* 16:36-43.

363 Lukaschek K, Erazo N, Baumert J, Ladwig KH. 2012. Suicide mortality in comparison to traffic accidents
364 and homicides as causes of unnatural death. An analysis of 14,441 cases in Germany in the
365 year 2010. *Int J Env Res Pub He* 9:924-931.

366 Maclure M. 1991. The case-crossover design: A method for studying transient effects on the risk of
367 acute events. *Am J Epidemiol* 133:144-153.

368 Mann JJ. 2013. The serotonergic system in mood disorders and suicidal behaviour. *Philos Trans R Soc*
369 *Lond B Biol Sci* 368:20120537.

370 McCall WV, Black CG. 2013. The link between suicide and insomnia: Theoretical mechanisms. *Curr*
371 *Psychiat Rep* 15:389.

372 Mergl R, Koberger N, Heinrichs K, Szekely A, Toth MD, Coyne J, et al. 2015. What are reasons for the
373 large gender differences in the lethality of suicidal acts? An epidemiological analysis in four
374 European countries. *PLoS One* 10:e0129062.

375 Moller-Leimkuhler AM. 2003. The gender gap in suicide and premature death or: Why are men so
376 vulnerable? *Eur Arch Psy Clin N* 253:1-8.

377 Müller H, Biermann T, Renk S, Reulbach U, Ströbel A, Kornhuber J, et al. 2011. Higher environmental
378 temperature and global radiation are correlated with increasing suicidality--a localized data
379 analysis. *Chronobiol Int* 28:949-957.

380 Nadorff MR, Nazem S, Fiske A. 2013. Insomnia symptoms, nightmares, and suicide risk: Duration of
381 sleep disturbance matters. *Suicide Life-Threat* 43:139-149.

382 O'Connor RC, Nock MK. 2014. The psychology of suicidal behaviour. *The Lancet Psychiatry* 1:73-85.

383 Ohberg A, Lonnqvist J. 1998. Suicides hidden among undetermined deaths. *Acta Psychiatr Scand*
384 98:214-218.

385 Page LA, Hajat S, Kovats RS. 2007. Relationship between daily suicide counts and temperature in
386 England and Wales. *Br J Psychiatry* 191:106-112.

387 Papadopoulous FC, Frangakis CE, Skalkidou A, Petridou E, Stevens RG, Trichopoulos D. 2005. Exploring
388 lag and duration effect of sunshine in triggering suicide. *J Affect Disord* 88:287-297.

389 Qin P, Hawton K, Mortensen PB, Webb R. 2014. Combined effects of physical illness and comorbid
390 psychiatric disorder on risk of suicide in a national population study. *Br J Psychiatry* 204:430-
391 435.

392 R Development Core Team. 2008. R: A language and environment for statistical computing. R
393 foundation for statistical computing. Vienna, Austria.

394 Robert Koch Institut. 2015. Gesundheit in Deutschland - Gesundheitsberichterstattung des Bundes.

395 Sadkowski M, Dennis B, Clayden RC, Elsheikh W, Rangarajan S, Dejesus J, et al. 2013. The role of the
396 serotonergic system in suicidal behavior. *Neuropsychiatr Dis Treat* 9:1699-1716.

397 Salib E. 1997. Elderly suicide and weather conditions: Is there a link? *Int J Geriatr Psychiatry* 12:937-
398 941.

399 Schneider B, Baumert J, Schneider A, Marten-Mittag B, Meisinger C, Erazo N, et al. 2011. The effect of
400 risky alcohol use and smoking on suicide risk: Findings from the German MONICA/KORA-
401 Augsburg cohort study. *Soc Psychiatry Psychiatr Epidemiol* 46:1127-1132.

402 Schneider B, Lukaschek K, Baumert J, Meisinger C, Erazo N, Ladwig KH. 2014. Living alone, obesity, and
403 smoking increase risk for suicide independently of depressive mood findings from the
404 population-based MONICA/KORA-Augsburg cohort study. *J Affect Disord* 152-154:416-421.

405 Srinivasan V, Smits M, Spence W, Lowe AD, Kayumov L, Pandi-Perumal SR, et al. 2006. Melatonin in
406 mood disorders. *World J Biol Psychiatry* 7:138-151.

407 Stanley IH, Hom MA, Rogers ML, Hagan CR, Joiner TE, Jr. 2016. Understanding suicide among older
408 adults: A review of psychological and sociological theories of suicide. *Aging Ment Health*
409 20:113-122.

410 Tang NK, Crane C. 2006. Suicidality in chronic pain: A review of the prevalence, risk factors and
411 psychological links. *Psychol Med* 36:575-586.

412 Tanskanen A, Tuomilehto J, Viinamaki H, Vartiainen E, Lehtonen J, Puska P. 2000. Smoking and the risk
413 of suicide. *Acta Psychiatr Scand* 101:243-245.

414 Thompson R, Hornigold R, Page L, Waite T. 2018. Associations between high ambient temperatures
415 and heat waves with mental health outcomes: A systematic review. *Public Health* 161:171-
416 191.

417 Tiihonen J, Halonen P, Tiihonen L, Kautiainen H, Storvik M, Callaway J. 2017. The association of
418 ambient temperature and violent crime. *Sci Rep* 7:6543.

419 Turecki G, Brent DA. 2016. Suicide and suicidal behaviour. *Lancet* 387:1227-1239.

420 Violani C, Lombardo C. 2003. Peripheral temperature changes during rest and gender differences in
421 thermal biofeedback. *J Psychosom Res* 54:391-397.

422 Vissoky B, Kapusta ND, Praschak-Rieder N, Dorffner G, Willeit M. 2014. Direct effect of sunshine on
423 suicide. *JAMA Psychiatry* 71:6.

424 Whitley E, Gunnell D, Dorling D, Smith GD. 1999. Ecological study of social fragmentation, poverty,
425 and suicide. *BMJ* 319:1034-1037.

426