

# **Impact of Ambient Air Pollution on Physical Activity and Sedentary Behavior in China: A Systematic Review**

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Compliance with Ethical Standards: This study is non-human subject research and is exempt from ethical approval by the corresponding author's university.

Conflict of interests: The authors have no conflict of interests to declare.

Funding sources: The study was partially funded by Guangzhou Sport University. The funder has no role in the design, execution, interpretation, or writing of the study.

## **Abstract**

This study systematically reviewed scientific evidence linking ambient air pollution to physical activity and sedentary behavior in China. A keyword and reference search was conducted in PubMed, Web of Science, and the Cochrane Library. Predetermined selection criteria included—study designs: interventions or experiments, retrospective or prospective cohort studies, cross-sectional studies, and case-control studies; subjects: people of all ages; exposures: specific air pollutants and/or overall air quality; outcomes: physical activity and/or sedentary behavior; and country/area: mainland China. Ten studies met the selection criteria and were included in the review. Six adopted a cross-sectional design and the remaining four adopted a prospective cohort design. Four studies assessed a specific air pollutant namely particulate matter with diameter  $< 2.5 \mu\text{g}/\text{m}^3$  (PM<sub>2.5</sub>), whereas the remaining six focused on overall air quality, defined using air quality indexes. Decline in overall air quality and increase in PM<sub>2.5</sub> concentration were found to be associated with reduced daily/weekly duration of outdoor leisure-time and/or transportation-related physical activity such as walking but increased duration of daytime/nighttime sleeping among Chinese residents. In contrast, evidence linking overall air quality and PM<sub>2.5</sub> concentration to sedentary behavior remains mixed and inconclusive. In conclusion, preliminary evidence indicates that ambient air pollution impacts Chinese residents' daily physical activity-related behaviors. Future studies adopting objective measures of physical activity and a longitudinal or experimental study design are warranted to examine the impact of air pollution on sensitive sub-

populations such as children, older adults and people with pre-existing conditions, and in locations outside China.

**Keywords:** Air quality; Air pollutant; Physical activity; Exercise; China; Literature review

# 1 **Introduction**

2

3 Although the adverse effects of ambient or outdoor air pollution on health have been  
4 extensively documented (World Health Orginaization 2018), much less is known regarding  
5 its impact on local residents' health behaviors, including physical activity, sedentary  
6 behavior, and sleeping. Increasing numbers of children and adults in both high-income and  
7 low- and middle-income countries (LMICs) fall short of the guidelines-recommended  
8 physical activity levels (Li 2016; Muntner et al. 2005). Physical inactivity is a leading risk  
9 factor for morbidity and mortality worldwide (Arsenault et al. 2010; Kruk 2014; Lee et al.  
10 2012). Sedentary behaviour refers to any waking behavior characterized by low energy  
11 expenditure while in a sitting, reclining or lying posture; long sedentary time has been found  
12 to adversely impact cardio-metabolic health (der Ploeg and Hillsdon 2017). The risk of all-  
13 cause and cardiovascular mortality significantly increases when total sedentary time is longer  
14 than 6–8 hours a day and/or total television watching time is longer than 3–4 hours a day  
15 (Patterson et al. 2018). More time spent outdoors is positively associated with moderate-to-  
16 vigorous intensity physical activity, helps people meet the guidelines-recommended physical  
17 activity level, and improves cardiorespiratory fitness (Schaefer et al. 2014).

18

19 Ambient air pollution may discourage people from engaging in regular outdoor physical  
20 activity through several mechanisms. First, exposure to air pollution is linked to decreased  
21 lung function, elevated blood pressure, and other cardiovascular and respiratory symptoms  
22 (Auchincloss et al. 2008; Brook et al. 2010; Cakmak et al. 2011), resulting in impaired  
23 exercise capacity and performance (Cutrufello et al. 2011; Marr and Ely 2010; Rundell and  
24 Caviston 2008). Second, smog appearance may discourage people from engaging in outdoor  
25 activities (Roberts et al. 2014). Finally, media alerts and warnings of poor air quality may

26 alter people's decision on spending time outdoors and engaging in physical activity (Saberian  
27 et al. 2017; Wen et al. 2009a). For example, the Canadian government developed a risk  
28 communication tool, the Air Quality Health Index (AQHI), which uses a 10-point scale from  
29 low to high risk to deliver information regarding the health implications of air pollution to the  
30 general public (Government of Canada 2015). In high air pollution days, the AQHI  
31 recommends to "reduce or reschedule strenuous activities outdoors" in order to mitigate the  
32 health risks of air pollution (Government of Canada 2017).

33

34 A previous review systematically identified and synthesized scientific literature that  
35 examined the impact of air pollution on physical activity (An et al. 2018). Among the seven  
36 studies included in the review (An et al. 2018), six were conducted in the U.S. and one in the  
37 U.K. All U.S.-based studies adopted a cross-sectional study design (An and Xiang 2015;  
38 Hankey et al. 2012; Roberts et al. 2014; Wells et al. 2012; Wen et al. 2009a; Wen et al.  
39 2009b), and the U.K.-based study adopted a prospective cohort design (Alahmari et al. 2015).  
40 Specific air pollutants assessed included particulate matter with diameter  $< 2.5 \mu\text{g}/\text{m}^3$   
41 ( $\text{PM}_{2.5}$ ), particulate matter with diameter  $< 10 \mu\text{g}/\text{m}^3$  ( $\text{PM}_{10}$ ), ozone ( $\text{O}_3$ ), and nitrogen oxides  
42 ( $\text{NO}_x$ ), whereas two studies focused on overall air quality (i.e., air quality index [AQI]). All  
43 studies found that air pollution was negatively associated with physical activity and positively  
44 associated with leisure-time physical inactivity. Study participants, in particular those with  
45 respiratory disease, reported a reduction in outdoor activities in order to mitigate the  
46 detrimental impact of air pollution. The meta-analysis based on cross-sectional studies found  
47 that one unit ( $\mu\text{g}/\text{m}^3$ ) increase in ambient  $\text{PM}_{2.5}$  concentration was associated with a 10%  
48 increase in the odds of physical inactivity among U.S. adults. Air pollution was measured by  
49 fixed monitoring stations (Hankey et al. 2012; Roberts et al. 2014; Wen et al. 2009b) or  
50 personal sensors (Alahmari et al. 2015). Five studies focused on the impact of air pollution

51 concentration on health behaviors (Alahmari et al. 2015; An and Xiang 2015; Hankey et al.  
52 2012; Roberts et al. 2014; Wen et al. 2009b), whereas the other two focused on the  
53 communication about air pollution in relation to health behaviors (Wells et al. 2012; Wen et  
54 al. 2009a). In particular, Wen et al (2009a) reported that media air pollution alerts via radio,  
55 television, and newspaper were associated with reduced outdoor physical activity among  
56 local residents. Wells et al (2012) reported that self-perceived air quality and air quality  
57 information communicated by local media were associated with changes in physical activity  
58 level among people with respiratory diseases. The review identified a few important  
59 limitations in the existing literature, including lack of large-scale longitudinal studies, self-  
60 reported physical activity levels that were prone to measurement error and social desirability  
61 bias, and lack of studies located in the LMICs.

62

63 It should be noted that the relationship between air pollution and physical activity may be  
64 nonlinear, and air pollution could impact physical activity behavior only after passing certain  
65 threshold concentration. In the U.S., most counties have already met the national air quality  
66 standards of PM<sub>2.5</sub> concentration levels, with fewer than 10 out of > 3,000 counties in the  
67 U.S. not meeting the national standard of 12.0 µg/m<sup>3</sup> (on annual mean concentration) by 2020  
68 (Environmental Protection Agency 2012). In sharp contrast, 365 out of the 366 major cities in  
69 China exceeded the PM<sub>2.5</sub> standard of 12 µg/m<sup>3</sup> in 2016 (Clean Air Asia 2016). The 100 most  
70 polluted cities (including many of the largest cities such as Beijing, Tianjin, and Chengdu)  
71 had annual average PM<sub>2.5</sub> concentration levels seven to 19 times as high as the U.S. national  
72 average (8.5 µg/m<sup>3</sup>) in 2015 (Clean Air Asia 2016). Air pollution is estimated to cause 1.6  
73 million deaths per year in China, roughly 17% of all deaths nationwide (Rohde and Muller  
74 2015). Thus, results from studies based in the U.S. and U.K. may not pertain to the high  
75 pollution settings in China (An et al. 2018). In a commentary article, Li et al. (2015)

76 speculated that the threat of the health damage of PM<sub>2.5</sub> air pollution could impact the  
77 implementation of China's physical activity programs (Li et al. 2015). In particular, Li et al.  
78 (2015) posits that severe ambient air pollution (e.g., AQI  $\geq$  300) may require cancellation of  
79 physical education classes or sport activities for school children (Li et al. 2015). Furthermore,  
80 both the actual air pollution level and the communication around it might impede older  
81 Chinese adults from engaging in popular outdoor activities such as walking and dancing.

82

83 This study aimed to systematically identify and review literature regarding the impact of  
84 outdoor air pollution on physical activity-related behaviors in China. It also aimed to identify  
85 the limitations and gaps in this field to guide future research.

86

## 87 **Methods**

88

### 89 *Study selection criteria*

90

91 Studies that met all of the following criteria were included in the review: (1) Study designs:  
92 interventions or experiments, retrospective or prospective cohort studies, cross-sectional  
93 studies, and case-control studies; (2) Subjects: people of all ages; (3) Exposures: specific air  
94 pollutants (e.g., PM<sub>10</sub>, PM<sub>2.5</sub>, O<sub>3</sub>, and NO<sub>x</sub>) and overall air quality; (4) Outcomes: physical  
95 activity, sedentary behavior, and sleeping; (5) country/area: mainland China; (6) Article type:  
96 peer-reviewed publications; (7) Time window of search: from the inception of an electronic  
97 bibliographic database to August 27, 2018; and (8) Language: articles written in English.

98

99 Studies that met any of the following criteria were excluded from the review: (1) Studies that  
100 exclusively focused on indoor air pollution; (2) Articles not written in English; and (3)  
101 Letters, editorials, study/review protocols, case reports, or review articles.

102

### 103 *Search strategy*

104

105 A keyword search was performed in three electronic bibliographic databases: PubMed, Web  
106 of Science, and the Cochrane Library. The search algorithm included all possible  
107 combinations of keywords from the following two groups: (1) “air pollutant”, “air  
108 pollutants”, “air pollution”, “air quality”, “particulate matter”, “PM2.5”, “PM10”, “outdoor  
109 pollution”, and “traffic pollution”; and (2) “health behavior”, “health behaviors”, “health  
110 behaviour”, “health behaviours”, “risk behavior”, “risk behaviors”, “risk behaviour”, “risk  
111 behaviours”, “motor activity”, “motor activities”, “sport”, “sports”, “physical fitness”,  
112 “physical exertion”, “physical activity”, “physical activities”, “physical inactivity”,  
113 “sedentary behavior”, “sedentary behaviour”, “sedentary behaviors”, “sedentary behaviours”,  
114 “sedentary lifestyle”, “sedentary lifestyles”, “inactive lifestyle”, “inactive lifestyles”, “sleep”,  
115 “sleeping”, “exercise”, “exercises”, “active living”, “active lifestyle”, “active lifestyles”,  
116 “outdoor activity”, “outdoor activities”, “walk”, “walking”, “run”, “running”, “jog”,  
117 “jogging”, “bike”, “biking”, “bicycle”, “bicycling”, “cycle”, “cycling”, “stroll”, “strolling”,  
118 “active transport”, “passive transport”, “active transportation”, “passive transportation”,



119 “active transit”, “active commuting”, “travel mode”, “mode of travel”, “physically active”,  
120 “physically inactive”, “sitting”, “TV”, “television”, “computer”, “video watching”, “watching  
121 video”, “video time”, “video games”, “internet use”, “screen time”, “screen-time”,  
122 “electronic game”, and “electronic games”. The search algorithm in PubMed is provided in  
123 **Appendix 1**. The Medical Subject Headings (MeSH) terms “air pollution”, “air pollutants”,  
124 “particulate matter”, “exercise”, “sports”, “health behavior”, and “health risk behaviors” were  
125 used in the PubMed search. All keywords in PubMed were searched with the “[All fields]”  
126 tag, which are processed using Automatic Term Mapping. The search function TS=Topic was  
127 used in Web of Science, which launches a search for topic terms in the fields of title, abstract,  
128 keywords, and Keywords Plus<sup>®</sup>. Titles and abstracts of the articles identified through the  
129 keyword search were screened against the study selection criteria. Potentially relevant articles  
130 were retrieved for evaluation of the full text. Two coauthors of this review independently  
131 conducted title and abstract screening and identified potentially relevant articles. Inter-rater  
132 agreement was assessed using the Cohen’s kappa ( $\kappa=0.80$ ). Discrepancies were resolved  
133 through discussion under the participation of a third coauthor. Besides the keyword search,  
134 we also conducted hand-searching in Google Scholar.

135  
136 It is important to note that we did not include any keywords and/or MeSH terms pertaining to  
137 China in the search algorithm. This substantially expanded the scope of search and increased  
138 article harvests, with the aim of comprehensively identifying relevant studies conducted in  
139 other LMICs besides China. However, no relevant study conducted in another LMIC was  
140 identified. Therefore, we decided to narrow our review scope to China-based studies on an ad

141 hoc basis.

142

### 143 *Data extraction and synthesis*

144

145 A standardized data extraction form was used to collect the following methodological and  
146 outcome variables from each included study: author(s), year of publication, study design,  
147 sample size, age range, proportion of females, sample characteristics, statistical model, data  
148 source, air pollution/quality level, measures of health behaviors, and key results.

149

150 We summarized the common themes and findings of the included studies narratively. A  
151 meta-analysis was proved infeasible due to overlapping samples. Specifically, An and Yu  
152 (2018) and Yu et al. (2017b) provided quantitative estimates for the impact of ambient PM<sub>2.5</sub>  
153 concentration on vigorous physical activity; however, both studies analyzed the same sample  
154 of freshmen at Tsinghua University in Beijing. In addition, Li and Kamargianni (2017, 2018)  
155 provided quantitative estimates for the impact of air pollution on walking and bike-sharing,  
156 but they examined the same study sample in Taiyuan. No other studies provided quantitative  
157 estimates for the impact of ambient air pollution on physical activity-related behaviors  
158 focusing on the same type and measure of air pollution and behavior.

159

160 The data extraction, theme identification, and narrative summarization were independently  
161 conducted by two coauthors of this review, (BLANK) and (BLANK). Discrepancies were  
162 resolved through discussion under the participation of a third coauthor, (BLANK).

163

### 164 *Study quality assessment*

165

166 We used the National Institutes of Health’s Quality Assessment Tool for Observational  
167 Cohort and Cross-Sectional Studies to assess the quality of each included study (National  
168 Institute of Health 2018). For each criterion, a score of one was assigned if “yes” was the  
169 response, whereas a score of zero was assigned otherwise (i.e., an answer of “no”, “not  
170 applicable”, “not reported”, or “cannot determine”). A study-specific global score, ranging  
171 from zero to 14, was calculated by summing up scores across all criteria. A higher score  
172 indicates a better study quality. Study quality assessment helped measure strength of  
173 scientific evidence but was not used to determine the inclusion of studies.

174

## 175 **Results**

176

### 177 *Study selection*

178

179 **Figure 1** shows the study selection flowchart. We identified a total of 14 183 articles through  
180 keyword and reference search, including 5 716 articles from PubMed, 8 242 articles from  
181 Web of Science, 224 articles from the Cochrane Library, and one article from Google Scholar  
182 through hand-searching. After removing duplicates, 13 013 articles underwent title and  
183 abstract screening, in which 12 996 articles were excluded. The remaining 17 articles were  
184 reviewed in full text against the study selection criteria. Of these, seven articles were  
185 excluded. The reasons for exclusion were that two articles were narrative review articles  
186 instead of original studies (Li et al. 2015; Lü et al. 2015), two articles were not based on

187 LMICs (Anowar et al. 2017; Di 2010), one article was a simulation study instead of a field  
188 study (de Sá et al. 2017), one article was a comment instead of an original study (Wang  
189 2016), and one article did not report any outcome pertaining to health behaviors (Braniš and  
190 Větvička 2010). In total, ten articles were included in the review (An and Yu 2018; Chen and  
191 Lin 2016; Hu et al. 2017; Li and Kamargianni 2017, 2018; Yang and Zacharias 2016; Yu et  
192 al. 2017a; Yu et al. 2017b; Zhang and An 2018; Zhao et al. 2018).

193

#### 194 *Basic characteristics of the included studies*

195

196 **Table 1** summarizes basic characteristics of the 10 China-based studies included in the  
197 review, all published within the past three years (two in 2016, four in 2017, and four in  
198 2018). Six of the 10 studies adopted a cross-sectional study design, and four adopted a  
199 longitudinal study design. The sample sizes ranged from 153 to 12 291: six studies had a  
200 sample size between 100 and 999, three between 1000 and 9 999, and one above 10 000. Four  
201 studies focused on adults aged 18 years and older, four studies focused on people of all ages,  
202 one study exclusively examined older adults, and one study did not report age. One study did  
203 not report the sex distribution in its sample, and the remaining nine studies recruited both  
204 sexes. The percentage of females across studies ranged from 30% to 62%, with a sample size-  
205 weighted average of 40%. A variety of statistical models were applied across studies,  
206 including logistic regression, multivariate nested logistic regression, multinomial logistic

207 regression, multivariate analysis of variance, linear individual fixed-effect regression, and  
208 autoregressive moving-average model.

209

210 **Table 2** summarizes the measures for air pollution and physical activity-related behaviors  
211 among the included studies. Eight studies used objective air pollution measures, and two used  
212 subjective air pollution measures reported by participants. Specific subjective measures of air  
213 pollution included questions such as “How severe is the air pollution in the area of your local  
214 residence?”, or “How important is the role of air pollution in your decision with regard to  
215 bicycle commuting?” Objective air pollution measures were constructed based on data  
216 collected from the local environment monitoring sites in China. Specifically, four studies  
217 examined ambient PM<sub>2.5</sub> concentration, and the other six focused on overall air pollution  
218 and/or AQI. Three studies examined the relationship of PM<sub>2.5</sub> concentration and weekly  
219 physical activity. One study examined the relationship of daily air quality and television use,  
220 one study examined the relationship of daily PM<sub>2.5</sub> concentration and cycling choice, and one  
221 study examined the relationship of daily air pollution and transportation mode choice. Five  
222 studies adjusted for some individual characteristics (e.g., age, marital status, annual  
223 household income, body mass index, smoking status, drinking status, and self-rated physical  
224 health) in the statistical analyses, and four studies adjusted for certain weather conditions  
225 (e.g., temperature, precipitation, and wind velocity).

226

227 Physical activity-related behaviors included physical activity (n=4), physical inactivity (n=1),  
228 television use (n=1), and transportation mode (n=4). Eight studies measured health behaviors  
229 using questionnaires administered to participants themselves, whereas the remaining two  
230 studies used objective measures (The Nielsen Watchbox for measuring real-time television  
231 use and mobile app). Self-reported health behavior questionnaires included both standardized  
232 questionnaires (e.g., International Physical Activity Questionnaire [IPAQ]) and general  
233 questions (e.g., “How often do you engage in vigorous exercise for at least 20 minutes per  
234 day in a way that makes you sweat or breath heavier than usual?” or “How many days over  
235 the past seven days did you participate in sitting activities such as watching TV, using  
236 computer, reading, or doing handcrafts?”). Among the studies that used subjective health  
237 behavior measures, four used measures validated in previous research (i.e., IPAQ and  
238 Physical Activity Scale for the Elderly [PASE]).

239

240 **Table 3** summarizes the key findings reported in the studies included in the review regarding  
241 the estimated impact of air pollution on health behaviors among Chinese residents. Chen and  
242 Lin (2016) examined the relationship between perceived air quality and physical inactivity  
243 among adults in China. They found that an improvement in perceived air quality was  
244 associated with a decline in physical inactivity rate (odds ratio = 0.80). Yang and Zacharias  
245 (2016) examined perceived air quality in relation to active commuting, and found that air  
246 pollution was a major deterrent for people’s decisions to commute by bicycle (odds ratio =  
247 0.98). Hu et al. (2017) collected exercise data spanning 160 days from 153 mobile app users

248 in China (Hu et al. 2017). This mobile app was used to record leisure-time physical activity  
249 as users needed to manually activate this app before starting exercises. Mobile app users were  
250 less likely to participate in outdoor running, biking, and walking activities as air pollution  
251 worsened, however, no difference in average distance and duration of exercise was found  
252 across different air pollution levels. It was concluded that people's participation in outdoor  
253 exercise was impeded by air pollution severity, but they tended to stick to their exercise  
254 routines if exercise was initiated. Li and Kamargianni (2017) examined air pollution in  
255 relation to transportation mode among residents in Taiyuan City. They found that severe air  
256 pollution was associated with reduced nonmotorized transportation such as biking and  
257 walking, whereas no association was found between air pollution and transportation mode  
258 when air pollution was moderate. Yu et al. (2017a) examined the longitudinal relationship  
259 between PM<sub>2.5</sub> and physical activity-related health behaviors among university retirees in  
260 Beijing, China. An increase in ambient PM<sub>2.5</sub> concentration by one standard deviation was  
261 associated with a reduction in weekly total hours of walking by 4.69, a reduction in leisure-  
262 time PASE score by 71.16, and a reduction in total PASE score by 110.67. Moreover, an  
263 increase in ambient PM<sub>2.5</sub> concentration by one standard deviation was associated with an  
264 increase in daily average hours of nighttime/daytime sleeping by 1.75. An and Yu (2018) and  
265 Yu et al. (2017b) assessed the impact of PM<sub>2.5</sub> air pollution on physical activity-related health  
266 behaviors among college students in Beijing, China. Health surveys were repeatedly  
267 administered among 12 000 newly admitted students at a major Chinese university during  
268 2012–2015. Ambient PM<sub>2.5</sub> concentration was negatively associated with time spent on

269 walking and vigorous physical activity, but positively associated with time spent on  
270 nighttime/daytime sleep among college freshmen. An increase in ambient PM<sub>2.5</sub>  
271 concentration by one standard deviation was associated with a reduction in weekly total  
272 minutes of walking by 7.3, a reduction in weekly total minutes of vigorous physical activity  
273 by 10.1, and an increase in daily average hours of nighttime/daytime sleep by 1.07. Zhang  
274 and An (2018) examined the impact of ambient air pollution on television use among  
275 residents in Shanghai, China. Device-measured daily average duration of television use  
276 during 2014–2016 was obtained from a random sample of 300 households linked to air  
277 pollution and weather data. The hypothesis was that ambient air pollution level as indicated  
278 by the AQI would be positively associated with daily television use through discouraging  
279 outdoor activities. In contrast to their hypothesis, fair and light air pollution, but not  
280 moderate-to-severe air pollution, was associated with reduced rather than increased television  
281 use. Compared to the days when air quality was good ( $0 \leq \text{AQI} \leq 50$ ), days with fair air quality  
282 ( $50 < \text{AQI} \leq 100$ ) and light air pollution ( $100 < \text{AQI} \leq 150$ ) were associated with a reduction in  
283 daily average television use by 2.9 and 4.6 minutes, respectively; whereas moderate-to-severe  
284 air pollution ( $\text{AQI} > 150$ ) was not found to be associated with daily average television use  
285 among Shanghai residents. In a cross-sectional study, Zhao et al. (2018) examined the impact  
286 of air pollution on cycling behavior when facing light, medium and heavy air pollution, and  
287 found that higher PM<sub>2.5</sub> concentration was associated with lower possibility of cycling among  
288 those who were male, over 30 years old, and of lower income.  
289



290 *Study quality assessment*

291

292 **Table 4** reports criterion-specific and global ratings from the study quality assessment for the  
293 included studies, which scored on average 9.5 out of 14, with a range from seven to 11. All  
294 studies included in the review clearly stated the research question and objective, specified and  
295 defined the study population, had a participation rate above 50%, recruited participants from  
296 the same or similar populations during the same time period, and pre-specified and uniformly  
297 applied inclusion and exclusion criteria to all potential participants. Seven studies  
298 implemented valid and reliable exposure measures, and examined different levels of the  
299 exposure in relation to the outcome. In contrast, none of the studies had the outcome  
300 assessors blinded to the exposure status of the participants, nor did they provide a sample size  
301 justification using power analysis. Two studies implemented valid and reliable outcome  
302 measures. Three studies measured exposures of interest prior to the outcomes.

303

304 **Discussion**

305

306 This study systematically reviewed scientific evidence linking ambient air pollution to  
307 physical activity-related behavior modifications in China. A total of 10 studies were  
308 identified. Six used a cross-sectional design and the remaining four used a prospective cohort  
309 design. Four studies assessed a specific air pollutant namely PM<sub>2.5</sub>, whereas the remaining six  
310 focused on overall air quality using AQI. Decline in overall air quality and increase in PM<sub>2.5</sub>  
311 concentration were found to be associated with reduced daily/weekly duration of outdoor

312 leisure-time and/or transportation-related physical activity such as walking, running and  
313 biking but increased duration of daytime/nighttime sleeping among Chinese residents. In  
314 contrast, evidence linking overall air quality and PM<sub>2.5</sub> concentration to sedentary behavior,  
315 such as watching TV, remains mixed and inconclusive.

316

317 Findings from this review coincide with the documented relationship between ambient air  
318 pollution and overall physical activity level in developed countries. Roberts et al. (2014)  
319 found that community-level air pollution was negatively associated with leisure-time physical  
320 activity among U.S. adults (Roberts et al. 2014). Wells et al. (2012) found that worsened air  
321 quality led to reduced time spent on outdoor activities in the U.S (Wells et al. 2012). Wen et  
322 al. (2009a) reported that media alerts of AQI contributed to decreased outdoor activities,  
323 especially in adults with asthma (Wen et al. 2009a). Findings from this review provided  
324 additional evidence linking air pollution to reduced overall physical activity level in China.

325

326 Evidence regarding the influence of overall air quality and PM<sub>2.5</sub> concentration on sedentary  
327 behavior remains lacking. Zhang and An (2018) reported that ambient air pollution was  
328 negatively associated with daily television use, but the association diminished as air quality  
329 further deteriorated. An and Yu (2018) and Yu et al (2017a) found that increased PM<sub>2.5</sub>  
330 concentration was associated with increased daily duration of sleeping among university  
331 freshmen and retirees in Beijing. Moreover, smog appearance of polluted air due to high  
332 particulate concentration may deter people from going outside but promote indoor activities,  
333 including sleep (Roberts et al. 2014). Therefore, it is possible that people spend more time

334 sleeping instead of engaging in physical activity under severe ambient air pollution (An and  
335 Yu 2018; Yu et al. 2017a).

336

337 Despite some emerging evidence linking elevated air pollution level to reduced outdoor  
338 physical activity, several important limitations pertaining to the existing research remain to  
339 be addressed. Relevant studies are scarce and concentrated in a few countries such as the U.S.  
340 and China. Most studies adopted self-reported physical activity measures that are susceptible  
341 to recall error and social desirability bias. Most studies did not report whether participants  
342 were aware of air pollution or air pollution was communicated to participants. A majority of  
343 studies focused on PM<sub>2.5</sub> and/or overall air quality (e.g., AQI) but other major air pollutants  
344 (e.g., PM<sub>10</sub>, CO, NO<sub>x</sub>, O<sub>3</sub>, and SO<sub>x</sub>) are less studied. All studies are observational (i.e., cross-  
345 sectional or longitudinal) in design, so that the findings may not imply causality. Non-U.S.  
346 studies predominantly recruited convenience samples, which compromises the  
347 generalizability to populations at risk. It is also possible that study participants to some extent  
348 mediated the influence of air pollution by switching from outdoor to indoor physical activity,  
349 or delay activity until high air pollution days are over, but such coping mechanisms were  
350 largely unexamined in the literature. A discrepancy between self-perceived and objectively  
351 measured air pollution severity may be present and exert a differential impact on an  
352 individual's decision to exercise, but no study has examined such potential discrepancy. Most  
353 studies focused on healthy adults, whereas studies on susceptible subpopulations, such as  
354 children, older adults, and patients with chronic conditions (e.g., chronic obstructive  
355 respiratory disease, cardiovascular disease, stroke or asthma) remain limited, even though the  
356 AQHI provides targeted message for these susceptible groups (Government of Canada 2017).  
357 This review solely focused on peer-reviewed publications written in English. Articles written  
358 in Chinese or other non-English languages were excluded. To our knowledge, ambient air

359 pollution in relation to physical activity-related behaviors is a new topic to research scholars  
360 in China. Relevant publications in Chinese can be scarce at the current stage but are expected  
361 to accumulate in the coming years.

362

363 Building upon previous research, future studies with the following features are warranted.

364 Firstly, there is a need for studies with objective measures of physical activity (e.g.,  
365 pedometer or accelerometer) that recruit large-scale nationally or regionally representative  
366 samples. Furthermore, future studies should consider examining susceptible populations such  
367 as children and patients with acute or chronic health conditions and follow them for an  
368 extended time period. New research should differentiate and contrast self-perceived versus  
369 objectively-measured air pollution levels in relation to behavioral modification and should  
370 attempt to assess people's decision making process regarding outdoor/indoor physical activity  
371 and sedentary behavior under different air pollution levels. In addition, researchers should  
372 also pay attention to whether and how air pollution is communicated to participants.

373 Furthermore, it would be valuable to distinguish the impact of air pollution by physical  
374 activity type (e.g., walking, biking, or gardening) and intensity (e.g., light-, moderate-, or  
375 vigorous-intensity physical activity). Finally, future research should consider examining the  
376 influence of air pollution on physical activity in other countries and regions besides China.

377

## 378 **Conclusion**

379

380 This study systematically reviewed scientific evidence regarding the influence of ambient air  
381 pollution on physical activity-related behaviors in China. Ten studies met the selection  
382 criteria and were included in the review. Decline in overall air quality and increase in PM<sub>2.5</sub>  
383 concentration were found to be associated with reduced daily/weekly duration of outdoor

384 leisure-time and/or transportation-related physical activity such as walking, running and  
385 biking but increased duration of daytime/nighttime sleeping among Chinese residents. In  
386 contrast, evidence linking overall air quality and PM<sub>2.5</sub> concentration to sedentary behavior  
387 remains mixed and inconclusive. Future studies adopting objective measures of physical  
388 activity and longitudinal/experimental design are warranted to examine the impact of air  
389 pollution on susceptible populations such as children and fragile older adults and residents in  
390 other developing countries besides China.

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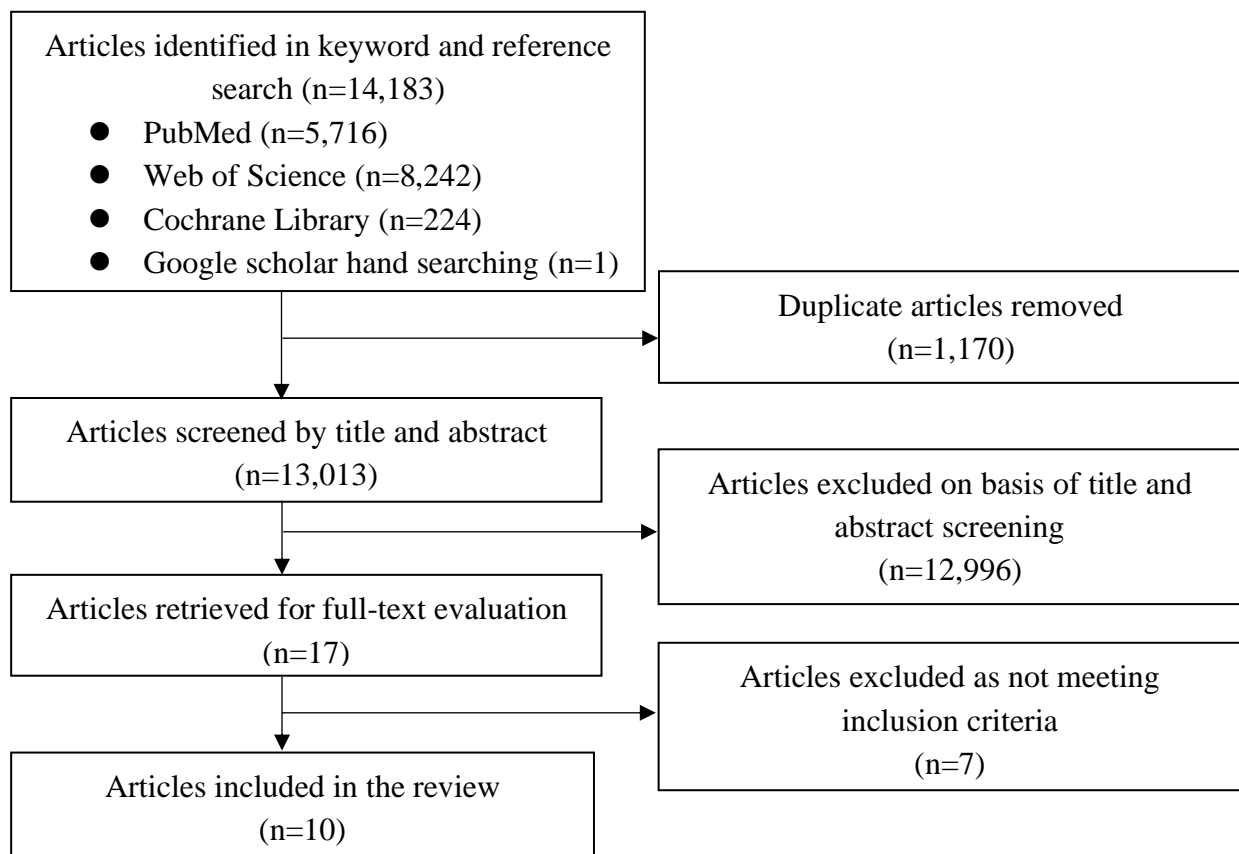
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**Figure 1** Study selection flowchart



**Table 1** Basic characteristics of the studies included in the review

Study ID	Authors, year	Country/city	Study design	Sample size	Age (years)	Female (%)	Sample characteristics	Statistical model	Study period	Setting
1	Chen & Lin, 2016	China	Cross-sectional	2268	42–49	52	Residents	Multivariate nested logistic regression	2010–2011	Urban
2	Yang & Zacharias, 2016	Beijing, China	Cross-sectional	852	≥60	41	Residents	Binary logistic regression	2013	Urban
3	Hu et al., 2017	China	Cross-sectional	153	36.8±7.9	30	App users	Multivariate analysis of variance	2014–2015	
4	Li & Kamargianni, 2017	Taiyuan, China	Cross-sectional	492	All ages	52	Residents	Multinomial logistic model	2015–2016	
5	Yu et al., 2017a	Beijing, China	Longitudinal	848–890	66.8 (95% CI: 66.4–67.3)	62 (95% CI: 59–65)	University retirees	Linear fixed-effect regression	2011–2016	Urban
6	Yu et al., 2017	Beijing, China	Longitudinal	3223–3242	18.2±0.9	32	University freshmen	Linear fixed-effect regression	2012–2013	Urban
7	An & Yu, 2018	Beijing, China	Longitudinal	12,184–12,291	18.1 (95% CI: 18.0–18.1)	33 (95% CI: 32–34)	University freshmen	Linear fixed-effect regression	2012–2015	Urban
8	Li & Kamargianni, 2018	Taiyuan, China	Cross-sectional	4769	All ages	49	Residents	Multivariate nested logistic regression	2015	Urban
9	Zhang & An, 2018	Shanghai, China	Longitudinal	300			Residents	Autoregressive moving-average model	2014–2016	
10	Zhao et al., 2018	Beijing, China	Cross-sectional	307	All ages	50	Residents	Binary logistic and multinomial logistic model	2015	Urban and suburb

**Table 2** Measures of air pollution and health behavior in the studies included in the review

Study ID	Type of air pollution measure	Detailed measure of air pollution	Type of health behavior measure	Detailed measure of health behavior	Adjusted covariates
1	Self-report questionnaire	Perceived air quality	Self-report questionnaire	Physical inactivity	Gender, age, marital status, chronic disease status, overweight status, psychological distress, country
2	Self-report questionnaire	Air pollution	Self-report questionnaire	Commute by bicycle	
3	Ministry of Environmental Protection, China	Air quality	Objective measure	Outdoor exercises	Age, sex
4	Ministry of Environment Protection, China, and Shanxi Meteorology	Daily air pollution	Self-report questionnaire	Mode choice behavior	
5	Mission China air quality monitoring program	Average ambient PM <sub>2.5</sub> concentration	Self-report questionnaire	Weekly hours of sedentary behavior, walking, biking, and motorized transportation; Leisure-time Physical Activity Scale for the Elderly (PASE) score; total PASE score; daily hours of sleeping	Age, marital status, annual household income, body mass index, smoking status, self-rated health, number of chronic diseases, days in hospital or homecare in last year, average daytime temperature, average wind speed, and percentage of rainy days over the last 7 days
6	Mission China air quality monitoring program	Hourly ambient PM <sub>2.5</sub> concentration	Self-report questionnaire: The short version of the International Physical Activity Questionnaire	Physical activity	Age, body mass index, current smoking status, current drinking status, self-rated physical health, self-rated mental health, average daytime temperature, average wind speed and percentage of rainy days in the last 7 days
7	Mission China air quality monitoring program	Average ambient PM <sub>2.5</sub> concentration	Self-report questionnaire: International Physical Activity Questionnaire	Total minutes of vigorous physical activity and walking in the last week; daily hours of sedentary behavior in the last week	Age, body mass index, current smoking status, current drinking status, self-rated physical health, self-rated mental health, average daytime temperature, average wind speed and percentage of rainy days in the last 7 days
8	Self-report questionnaire	Air pollution	Self-report questionnaire	Transport mode	
9	Shanghai Environmental Monitoring Center	Daily air quality index (AQI)	Objective measure	Daily average duration of television use	Daily maximum air temperature, a rainy day, wind velocity, day of the week, month of the year, year, national holiday
10	Beijing Municipal Environmental Protection Bureau	Daily average PM <sub>2.5</sub> concentration	Self-report questionnaire	Cycling experiences and daily cycling trip information	

**Table 3** Estimated effects of air pollution on health behavior in the studies included in the review

Study ID	Estimated effects of air pollution on health behavior	Main findings
1	One-unit increase of perceived air quality is associated with a reduction in physical inactivity by 20% (OR=0.80, 95% CI = 71%, 89%).	Improved perceived air quality was associated with decreased likelihood of physical inactivity.
2	Air pollution, traffic safety, the lack of road space, climatic disadvantages, insufficient secure parking for bicycles, and inadequate night lighting are seen as major barriers by all commuters.	Air pollution might be a major and increasing obstacle for bicycle use in Beijing.
3	App users were less likely to participate in outdoor running, biking, and walking (F = 24.16, p < 0.01) when air pollution concentration increased.	People's participation in outdoor exercise was impeded by air pollution severity, but they stick to their exercise routines once exercise was initiated.
4	In winter, biking (Coefficient = -0.009, t-Statistic = -2.63), bike-sharing (Coefficient = -0.058, t-Statistic = -6.71), and walking (Coefficient = -0.018, t-Statistic = -5.12) were not preferred when air pollution level increased. Instead travelers switched to the use of cars (Coefficient = 0.015, t-Statistic = 5.63), buses (Coefficient = 0.0002, t-Statistic = 0.06), taxis (Coefficient = 0.003, t-Statistic = 0.65), and electric bikes (Coefficient = 0.003, t-Statistic = 1.35). In summer, air pollution was negatively correlated with walking (Coefficient = -0.001, t-Statistic = -0.13) but positively correlated with biking (Coefficient = 0.016, t-Statistic = 1.85) and bike-sharing (Coefficient = 0.017, t-Statistic = 2.20).	Improved air quality had a positive impact on nonmotorized transport use. Severe air pollution could discourage the use of all nonmotorized transport modes (e.g., biking, bike-sharing, walking). However, when air pollution became moderate, a change in air pollution level did not have a significant impact on mode choice.
5	An increase in ambient PM <sub>2.5</sub> concentration by 1 standard deviation (56.6 µg/m <sup>3</sup> ) was associated with a reduction in weekly total hours of walking by 4.69 (95% CI = 1.30, 8.08), a reduction in leisure-time Physical Activity Scale for the Elderly (PASE) score by 71.16 (95% CI = 28.91, 113.41), and a reduction in total PASE score by 110.67 (95% CI = 59.25, 162.08). An increase in ambient PM <sub>2.5</sub> concentration by one standard deviation was associated with an increase in daily average hours of nighttime/daytime sleeping by 1.75 (95% CI = 1.24, 2.26).	Air pollution significantly discouraged Chinese older adults from engaging in daily physical activities.
6	An increase in ambient PM <sub>2.5</sub> concentration by one standard deviation (44.72 µg/m <sup>3</sup> ) was associated with a reduction in 22.32 weekly minutes of vigorous physical activity (95% CI = 19.77, 24.88), a reduction in 10.63 weekly minutes of moderate physical activity (95% CI = 6.64, 14.61), a reduction in 32.45 (95% CI: 27.28, 37.63) weekly minutes of moderate to vigorous physical activity (MVPA),	Ambient PM <sub>2.5</sub> air pollution significantly discouraged physical activity among Chinese freshmen students living in Beijing.

and a reduction in 226.14 (95% CI = 256.06, 196.21) weekly physical activity MET-minute scores.

An increase in the ambient PM<sub>2.5</sub> concentration by one standard deviation (36.5 µg/m<sup>3</sup>) was associated with a reduction in weekly total minutes of walking by 7.3 (95% CI = 5.3, 9.4), a reduction in weekly total minutes of vigorous physical activity by 10.1 (95% CI = 8.5, 11.7), a reduction in daily average hours of sedentary behavior by 0.06 (95% CI = 0.02, 0.10).

Air pollution had significant negative effect on bike-sharing choice (Coefficient = -0.0045, t-Statistic = -8.29); Air pollution also had significant negative impact on walking (Coefficient = -0.0045, t-Statistic = -9.17), electric bike use (Coefficient = -0.0022, t-Statistic = -3.93), and bus use (Coefficient = -0.0020, t-Statistic = -2.65); Car-sharing (Coefficient = 0.0023, t-Statistic = 1.96) was the only transportation mode that had a positive correlation with air pollution level.

There was a negative non-linear relationship between air pollution level and television use. Compared to the days when air quality was good (0 ≤ AQI ≤ 50), days with fair air quality (50 < AQI ≤ 100), light air pollution (100 < AQI ≤ 150), and moderate-to-severe air pollution (AQI > 150) were associated with a reduction in daily average television use by 2.9 (p = 0.002), 4.6 (p < 0.001), and 1.9 (p = 0.369) minutes, respectively.

Residents with lower income (Coefficient = 0.58, 95% CI = -0.00, 1.16), those over 30 years old (Coefficient = 0.67, 95% CI = 0.11, 1.22), and male respondents were more likely to continue cycling in hazy weather.

Ambient PM<sub>2.5</sub> air pollution was inversely associated with physical activity level.

Air pollution had significant negative effect on bike-sharing choice. Apart from bike-sharing, air pollution also has significant negative impact on walking, electric bike and bus choices. Car-sharing is the only mode that displays positive correlation between its utility and higher air pollution level. Bus usage is negatively correlated with air pollution. However, younger and less wealthy people would still use bus service even if air quality became worse.

Modest but not more severe air pollution was associated with reduced television use.

Hazy weather could reduce cycling and encourage people to switch to other travel modes, especially motorized travel modes. Higher PM<sub>2.5</sub> concentration contributes to a lower possibility of continuing cycling, with socio-economic variations. People with higher probabilities of persisting in cycling in polluted air are more likely to be male, over 30 years, lower income, and those who live outside the city center.

**Table 4** Study quality assessment

Criterion	Study ID									
	1	2	3	4	5	6	7	8	9	10
1. Was the research question or objective in this paper clearly stated?	Y	Y	Y	Y	Y	Y	Y	Y	Y	Y
2. Was the study population clearly specified and defined?	Y	Y	Y	Y	Y	Y	Y	Y	Y	Y
3. Was the participation rate of eligible persons at least 50%?	Y	Y	Y	Y	Y	Y	Y	Y	Y	Y
4. Were all the subjects selected or recruited from the same or similar populations (including the same time period)? Were inclusion and exclusion criteria for being in the study pre-specified and applied uniformly to all participants?	Y	Y	Y	Y	Y	Y	Y	Y	Y	Y
5. Was a sample size justification, power description, or variance and effect estimates provided?	N	N	N	N	N	N	N	N	N	N
6. For the analyses in this paper, were the exposure(s) of interest measured prior to the outcome(s) being measured?	N	N	N	N	Y	Y	Y	N	N	N
7. Was the timeframe sufficient so that one could reasonably expect to see an association between exposure and outcome if it existed?	Y	Y	Y	Y	Y	Y	Y	Y	Y	Y
8. For exposures that can vary in amount or level, did the study examine different levels of the exposure as related to the outcome (e.g., categories of exposure, or exposure measured as continuous variable)?	Y	N	Y	Y	Y	Y	Y	N	Y	N
9. Were the exposure measures (independent variables) clearly defined, valid, reliable, and implemented consistently across all study participants?	N	N	Y	Y	Y	Y	Y	N	Y	Y
10. Was the exposure(s) assessed more than once over time?	Y	Y	Y	Y	Y	Y	Y	Y	Y	Y
11. Were the outcome measures (dependent variables) clearly defined, valid, reliable, and implemented consistently across all study participants?	N	N	Y	N	N	N	N	N	Y	N
12. Were the outcome assessors blinded to the exposure status of participants?	N	N	N	N	N	N	N	N	N	N
13. Was loss to follow-up after baseline 20% or less?	Y	Y	Y	Y	Y	Y	Y	Y	Y	Y
14. Were key potential confounding variables measured and adjusted statistically for their impact on the relationship between exposure(s) and outcome(s)?	Y	N	Y	N	Y	Y	Y	N	Y	N
<b>Total score</b>	9	7	11	9	11	11	11	7	11	8

*Notes:* This study quality assessment tool was adopted from the National Institutes of Health’s Quality Assessment Tool for Observational Cohort and Cross-Sectional Studies. For each criterion, a score of one was assigned if “Y” was the response, whereas a score of zero was assigned otherwise. A study-specific global score, ranging from zero to 14, was calculated by summing up scores across all 14 criteria. Study quality assessment helped measure strength of scientific evidence, but was not used to determine the inclusion of studies.