

1 **Ambient particulate air pollution and blood pressure in peri-urban India**

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17 **Data and code availability**

18 Data is available through a formal collaborator request to APCAPS (see: [http://apcaps.lshtm.ac.uk/apply-](http://apcaps.lshtm.ac.uk/apply-to-collaborate/)
19 [to-collaborate/](http://apcaps.lshtm.ac.uk/apply-to-collaborate/)). The computing code required to replicate the results reported is by contacting the
20 correspondence author.

21

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1 **Conflicts of interest**

2 None declared

3

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1 **ABSTRACT**

2 **Background:** Evidence linking long-term exposure to particulate air pollution to blood pressure (BP) in
3 high-income countries may not be transportable to low- and middle-income countries. We examined
4 cross-sectional associations between ambient fine particulate matter (PM_{2.5}) and black carbon (BC) with
5 BP (systolic (SBP) and diastolic (DBP)) and prevalent hypertension in adults from 28 peri-urban villages
6 near Hyderabad, India.

7

8 **Methods:** We studied 5531 participants from the Andhra Pradesh Children and Parents Study (18-84
9 years, 54% men). BP was measured (2010-2012) in the right arm and hypertension was defined as SBP
10 ≥ 130 mm Hg and/or DBP ≥ 80 mm Hg. We used land use regression models to estimate annual average
11 PM_{2.5} and BC at participant's residence. We applied linear and logistic nested mixed-effect models
12 stratified by sex and adjusted by cooking fuel type to estimate associations between within-village PM_{2.5}
13 or BC and health.

14

15 **Results:** Mean (SD) PM_{2.5} was 32.8 $\mu\text{g}/\text{m}^3$ (2.7) and BC was 2.5 $\mu\text{g}/\text{m}^3$ (0.2). In women, a 1 $\mu\text{g}/\text{m}^3$
16 increase in PM_{2.5} was associated with 1.4 mm Hg higher SBP (95%CI: 0.1, 2.7), 0.9 mm Hg higher DBP
17 (95%CI: -0.2, 1.9) and 4% higher odds of hypertension (95%CI: 0%, 9%). In men, associations with SBP
18 (0.5 mm Hg; 95%CI: -0.8, 1.9), DBP (0.4 mm Hg; 95%CI: -0.7, 1.5), and hypertension (2% higher odds;
19 95%CI: -2%, 6%) were weaker. No associations were observed with BC.

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21 **Conclusions:** We observed a positive association between ambient PM_{2.5} and BP and hypertension in
22 women. Longitudinal studies in this region are needed to corroborate our findings.

23

24 **Keywords:** blood pressure, hypertension, ambient air pollution, particulate matter, black carbon,
25 cardiovascular health, lower-middle income country, India

26

1 **INTRODUCTION**

2 High blood pressure (BP) is the leading risk factor for all-cause mortality and morbidity globally.¹ The
3 prevalence of high BP has increased over the past decades² and is projected to increase by 60% by 2025.³
4 Although high BP is a worldwide public health concern, 80% of the burden is in low- and middle-income
5 countries (LMICs).⁴ Of all adults with high BP in 2015 (1.1 billion), an estimated 44% lived in South and
6 East Asia and 18% in India.²

7
8 Besides genetic and lifestyle factors, environmental factors such as air pollution can affect BP.⁵ A number
9 of studies have reported an association between short-term changes (i.e., hours to days) in ambient levels
10 of fine particulate matter (PM_{2.5}) and BP.⁶⁻⁹ Relatively fewer studies have assessed the association
11 between long-term (i.e., months to years) exposure to PM_{2.5} and BP, with most⁶⁻¹² (but not all¹³⁻¹⁷)
12 studies reporting a positive association. Identifying the key sources of PM_{2.5} responsible for the observed
13 associations remains an area of intense interest, with some evidence that combustion-related particles,
14 often assessed as black carbon (BC), may be particularly relevant for cardiovascular health.^{8,18,19}

15
16 Air pollution levels in LMICs are typically higher than in high-income countries (HICs), with 59% of air-
17 pollution associated deaths occurring in Asia.²⁰ Despite the combined burden from high BP and air
18 pollution in LMICs, to date, most studies evaluating the association between long-term exposure to PM_{2.5}
19 and BP have been conducted in HICs.^{6-9,18,21,22} Findings from these studies may have limited
20 transportability to populations in LMICs because of a confluence of genetic, lifestyle, and environmental
21 differences.^{9,23,21,24} Epidemiological studies in LMICs can therefore shed light on the exposure-response
22 relationship in populations exposed to higher ambient concentrations. Moreover, in LMICs, the sources of
23 ambient PM are potentially different than those found in HICs,^{23,24} implying differences in particle
24 composition and toxicity.

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1 There are various calls for greater understanding of the etiologic role of ambient air pollution in
2 cardiovascular health in LMICs,^{7,21,22,24–26} especially in India.^{22,24} In response, we examined associations
3 between long-term exposure to ambient particulate air pollution, systolic (SBP) and diastolic blood
4 pressure (DBP), and prevalent hypertension in adults from peri-urban India.

5

6 **METHODS**

7 **Study population and ethics**

8 We used data from the third follow-up of the Andhra Pradesh Children and Parents Study (APCAPS)
9 intergenerational cohort.²⁷ This cohort includes individuals enrolled in the first follow-up (2003-2005)
10 who were born during 1987-1990 (i.e. index children). The cohort was expanded in the third follow-up
11 (2010-2012) to include their parents and siblings (Figure S1). Questionnaire and vascular health data were
12 collected from 6944 participants between 2010 and 2012, at one time point per participant. We included
13 adults (≥ 18 years) and non-pregnant women (n=6227; 1315 index children and 4912 family members).

14

15 This study was approved by the ethics committees of the London School of Hygiene & Tropical Medicine
16 (London, UK), the National Institute of Nutrition (Hyderabad, India), the Indian Institute of Public Health
17 (Hyderabad, India), and Parc de Salut MAR (Barcelona, Spain). Signed informed consent forms were
18 obtained from all participants.

19

20 **Study area**

21 Participants resided in 28 villages in a peri-urban area²⁸ (of 543 km²) southeast of Hyderabad (**Figure 1**).
22 Villages differed regarding their degree of urbanization, population size (from 546 to 21 262 people in
23 2013), proximity to Hyderabad (29 to 66 km), socioeconomic status, and primary cooking fuel.

24

25 **Blood pressure measurements**

1 We measured SBP and DBP in the right arm in a sitting position after 5 min of rest using an oscillometric
2 device (Omron HEM 7300; Omron, Matsusaka Co., Japan) and an appropriate sized cuff. Measurements
3 were made in clinics established in study villages as part of APCAPS. Participants were asked to refrain
4 from performing vigorous exercise, eating or drinking anything other than water, smoking or taking drugs
5 30 min prior to the measurement. Three consecutive BP readings were obtained, leaving 1 minute
6 between successive readings. We used the average of the three readings as the estimate of BP in the main
7 analyses, and the average of the last two of the three BP readings in sensitivity analyses. Research staff
8 recorded the room temperature. We defined hypertension as SBP \geq 130 mm Hg and/or DBP \geq 80 mm
9 Hg.²⁹

10

11 **Air pollution exposure**

12 Within the framework of the CHAI project (Cardiovascular Health effects of Air pollution in Andhra
13 Pradesh, India),³⁰ we estimated annual average ambient concentrations of PM_{2.5} and BC at participants'
14 residential address using land-use regression (LUR) models developed for the study area.³¹ Briefly, two
15 monitoring sessions were performed in two seasons between 2015 and 2016 in 23 sites of the study area.
16 Adjusted R² for PM_{2.5} and BC models were 58% and 79%, respectively.

17

18 **Covariates**

19 We collected data on socio-demographic, health, lifestyle, and household characteristics via questionnaire
20 administered by a trained interviewer. The questionnaire (available at:

21 <http://apcaps.lshtm.ac.uk/questionnaires/>) also included questions related to dietary intake over the past
22 year (evaluated through a semi-quantitative food frequency questionnaire) and physical activity over the
23 preceding week. Development and validation of the APCAPS questionnaire sections is described
24 elsewhere.^{32,33} We assessed socio-economic status using the Standard of Living Index (SLI), a household
25 level asset-based scale based on principal component analysis and designed for the Indian population.²⁷

26 Tertiles were derived to identify low, middle, and high SLI. We measured height (in m) and weight (in

1 kg) during the clinic visit. Body mass index (BMI) was calculated accordingly (weight divided by squared
2 height).

3

4 **Data analysis**

5 We identified potential confounders using prior evidence and bivariate associations with the outcome
6 and/or the exposure, as illustrated using DAGitty 2.3³⁴ in a directed acyclic graph (Figure S2). Given the
7 importance of sex as a determinant of baseline health status, socio-economic and lifestyle factors, and
8 time-activity patterns influencing residential exposure,³⁵ we decided *a priori* to stratify all analysis by
9 sex, but we also report results for the whole study population. We excluded participants with missing data
10 on sex (n=5), household ID (n=82), BP (n=3), and LUR-predicted estimates (n=580). We also excluded
11 participants with SBP - DBP < 15 mm Hg (n=5) and those in whom BP was measured in the left arm
12 (n=21); leaving 5531 participants for analysis (1165 index children and 4366 family members).

13 Missingness of some covariates varied by village; we therefore multiply imputed missing data in our
14 covariates using the method of chained equations.³⁶ We created $m=20$ imputed datasets³⁷ using the same
15 covariates included in the model 4 dataset (see below) as input and pooled each m estimate using Rubin's
16 rules.³⁸

17

18 Participants lived in 2296 households (on average 2 participants per household) within 28 villages. To
19 estimate within-village associations between PM_{2.5} or BC and health, we applied nested (linear for BP and
20 logistic for hypertension) mixed-effects models in which both the within and between village exposure-
21 outcome relationships were modeled explicitly, an approach referred to as within-between model
22 specification.^{39,40} Compared to random-effects estimation,^{39,40} within-between specification is better suited to
23 model scenarios in which the exposure may be correlated with the random effects (thereby being subject
24 to bias), sample size is large, and within-group variability of the exposure is limited.⁴¹ Although
25 conceptually analogous to fixed-effects estimation, within-between specification has the advantage of

1 adjusting for the between-group unobserved effects using fewer degrees of freedom.⁴⁰ We used the
2 following regression equation (all components expressed in scalar form):

$$y_{vhi} = \beta_0 + \beta_w(x_{vhi} - \bar{x}_v) + \beta_B\bar{x}_v + (u_v + u_{vh} + e_{vhi}) + covariates$$

3
4
5 where y_{vhi} represents the outcome in village v , household h and individual i ; β_0 represents a constant;
6 β_w represents the within-village effect estimated as the effect of the difference between the individual
7 exposure (x_{vhi}) and the village mean (\bar{x}_v) on the outcome; β_B represents the village mean exposure
8 (between effect); u represent the random intercepts for the nested household (u_{vh}) within village (u_v);
9 and e_{vhi} the error term.

10

11 Household air pollution is an additional important source of personal and ambient air pollution in this
12 region. We therefore explored the role of type of primary cooking fuel (biomass vs. clean) as potential
13 confounder through adjustment and as a potential effect measure modifier through stratified analyses in
14 women. For each air pollution metric and continuous outcome, we fitted the following regression models:

15

- 16 - **model 1** (basic): adjusted for age, antihypertensive medication, and mean village concentration
- 17 - **model 2** (cooking fuel adjusted): model 1 + cooking fuel
- 18 - **model 3** (main): model 2 + education attainment, SLI, physical activity, environmental tobacco
19 smoke, active smoking (only in men), alcohol, room temperature, and salt intake
- 20 - **model 4** (including potential mediators): model 3 + BMI and diabetes

21

22 Results are expressed as change in BP outcome (in mm Hg) per 1 $\mu\text{g}/\text{m}^3$ increase in within-village $\text{PM}_{2.5}$
23 and per inter-quartile range (IQR) increase in within-village BC. For prevalent hypertension as a
24 dichotomous outcome, we only fit model 3. We explored potential non-linearity for all continuous

1 covariates (age, physical activity, temperature, salt intake, and BMI) by adding a natural spline with 3
2 degrees of freedom. The full model allowing for non-linearity in age is shown in Table S1. For
3 categorical covariates, we used the same categories shown in **Table 1**.

4
5 To assess the robustness of our findings, we conducted multiple sensitivity analyses using model 3: i)
6 defining the outcome as the average of the last two BP readings, since the first BP reading can be higher
7 than subsequent ones; ii) excluding participants taking antihypertensive medication (n=195); iii)
8 conducting a leave-one-village-out analysis (i.e. removing each of the villages one at a time); and iv)
9 including village as a fixed effect with only a random intercept for household. As secondary analysis, we
10 refit models 3 and 4 stratified by age (≤ 40 years vs. > 40 years) while adjusting for sex and age. Analyses
11 were conducted with R (version 3.5.0) using packages “mice”³⁶ and “lme4”⁴².

12

13 **RESULTS**

14 **Participants’ characteristics and blood pressure levels**

15 The 5531 participants included were 54% male, had a mean age of 38 years, and had a mean BMI of 21
16 kg/m² (**Table 1**). Compared to men, women tended to be older, more physically active, had less formal
17 education, higher BMI, lower household SLI, and consumed less tobacco and alcohol. Few participants
18 (6%) reported previous diagnosis of hypertension, although we identified 46% of participants as
19 hypertensive based on measured BP. On average, men had higher SBP (124 mm Hg vs. 118 mm Hg),
20 DBP (81 mm Hg vs. 78 mm Hg), and prevalent hypertension (52% vs. 39%) than women.

21

22 **Air pollution levels**

23 Ambient annual averages were 32.8 $\mu\text{g}/\text{m}^3$ (range: 24.4 to 38.2) for PM_{2.5} and 2.5 $\mu\text{g}/\text{m}^3$ (range: 1.6 to
24 3.1) for BC (**Table 1**). The IQRs of within-village levels were 0.3 $\mu\text{g}/\text{m}^3$ for PM_{2.5} and 0.1 $\mu\text{g}/\text{m}^3$ for BC.
25 BC had more within-village variability than PM_{2.5} (**Figure 2**). All participants were exposed to higher
26 annual average PM_{2.5} than the World Health Organization guideline (10 $\mu\text{g}/\text{m}^3$) and the US Environmental

1 Protection Agency ($12 \mu\text{g}/\text{m}^3$) air quality standard. Almost all participants (96%) had exposures above the
2 European Union Air Quality Standards ($25 \mu\text{g}/\text{m}^3$).

3
4 (Table 1 here)

5

6 **Associations between air pollution and blood pressure and hypertension**

7 A $1 \mu\text{g}/\text{m}^3$ increase in within-village $\text{PM}_{2.5}$ was associated with 1.5 mm Hg (95% Confidence Interval (CI):
8 0.2, 2.7) higher SBP among women (**Table 2; Model 3**). The association for DBP was also positive but
9 smaller in magnitude. Associations between $\text{PM}_{2.5}$ and BP were smaller in men compared to women and
10 the CIs included the null. BC was not associated with either SBP or DBP in either men or women. When
11 further adjusting for BMI and diabetes – which may be considered either confounders or potential causal
12 intermediates between air pollution and hypertension – associations were generally similar, but slightly
13 weaker for $\text{PM}_{2.5}$ in men and for BC in women (**Table 2; Model 4**). In the whole study population (men
14 and women), a $1 \mu\text{g}/\text{m}^3$ increase in within-village $\text{PM}_{2.5}$ was associated with 1.0 mm Hg (95% CI: 0.1, 2.0)
15 higher SBP and 0.7 mm Hg (-0.1, 1.5) higher DBP. BC was not associated with either SBP (-0.03 mm
16 Hg; -0.5, 0.5) or DBP (0.02 mm Hg; -0.4, 0.4). Stratified analyses by age are presented in Table S2. There
17 was slight indication of stronger $\text{PM}_{2.5}$ -SBP and weaker $\text{PM}_{2.5}$ -DBP associations in the older (vs.
18 younger) group. However, differences in point estimates were small and CIs were overlapping. Stratified
19 analyses by cooking fuel for women are presented in Table S3. The point estimate between $\text{PM}_{2.5}$ and
20 SBP was larger in women using biomass; however, CIs were wide and overlapping with those of women
21 using clean fuels.

22

23 A $1 \mu\text{g}/\text{m}^3$ increase in within-village $\text{PM}_{2.5}$ was associated with an adjusted odds ratio of hypertension of
24 1.04 (95% CI: 1.00, 1.09) in women, 1.02 (0.98, 1.07) in men, and 1.03 (1.00, 1.07) across both sexes. For
25 each $0.1 \mu\text{g}/\text{m}^3$ increase in within-village BC, the adjusted odds ratio of hypertension was 1.01 (0.99,
26 1.03) in women, 0.99 (0.97, 1.02) in men, and 1.00 (0.99, 1.02) when including both men and women.

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(Table 2 here)

Sensitivity analyses

Results were similar in sensitivity analyses (Table S1). When excluding participants taking antihypertensive medication (model S2), the effect of PM_{2.5} on DBP in women was slightly stronger (1.0; 95%CI: -0.1, 2.0) per 1 µg/m³ increase in PM_{2.5}. When using fixed rather than random effects for village (model S3) which more stringently controls for differences between villages, we observed a very similar point estimate for the association between PM_{2.5} and SBP in women. Also in women, results were fairly robust to the exclusion of specific villages, with exception of villages 1 and 14 (**Figure 3**), possibly because of the high number of participants in these villages. The pattern was similar for men (Figure S3).

DISCUSSION

In this cross-sectional study, we observed positive associations between long-term exposure to ambient PM_{2.5} and BP and prevalent hypertension among women. Stronger associations were found for SBP than DBP. Associations in men were weaker and included the null. Long-term exposure to BC was not associated with BP or hypertension either in women or men. Results were robust in sensitivity analyses. Models adjusting for primary cooking fuel (biomass vs. clean) suggests that PM_{2.5}-SBP association in women was independent of type of fuel used for cooking.

Previous studies have reported sex-adjusted estimates or have focused only on one sex,⁹ making comparison of our sex-specific results difficult. Sex-specific (or gender-specific) effects of air pollution are often determined by differences in time-activity patterns. In the study population, women spend the majority of their time near home (83% of the daytime vs. 57% for men).³⁵ This suggests that residence-based exposure estimates may be more relevant for women than for men in this setting, and may explain why we observed stronger associations between PM_{2.5} and BP in women. Women cooking with solid

1 fuels have generally higher SBP and DBP than clean fuel users.⁴³ In a study by Liu *et al*¹⁰ in China,
2 higher levels of ambient PM_{2.5} were associated with higher SBP in individuals using solid fuels for
3 cooking. However, our stratified analysis in women was not sufficiently powered to assess if the
4 association observed between ambient PM_{2.5} and SBP may be modified by the cooking fuel used.
5
6 Most studies investigating long-term ambient PM in relation to BP have been conducted either in urban
7 areas where air pollution is typically dominated by traffic sources or in HICs, where PM_{2.5} concentrations
8 are considerably lower (<20 µg/m³) than in our study (33 µg/m³). Our study is likely more comparable to
9 two nationwide studies conducted in China, which include rural areas and with similar ambient PM_{2.5}
10 levels (≥30 µg/m³).^{10,11} Both studies found stronger PM_{2.5}-SBP associations than PM_{2.5}-DBP, which is
11 consistent with our results. Liu *et al* found a 0.6-mm Hg (95% CI: 0.1, 1.1) increase in SBP and 0.02-mm
12 Hg increase in DBP (95% CI: -0.3, 0.3) per 42 µg/m³ increase in PM_{2.5} in adults ≥35 years old.¹⁰ Lin *et al*
13 found an increase in both SBP (1.3 mm Hg; 95% CI: 0.04, 3.6) and DBP (1.0 mm Hg; 95% CI: 0.3, 1.8)
14 per 10 µg/m³ increase in PM_{2.5} in middle-aged (≥50 years) adults.¹¹ The magnitude of our PM_{2.5}-SBP
15 association in women was ~10 times greater than these Chinese studies (after rescaling all estimates to 1
16 µg/m³ increase). A range of factors may explain the higher magnitude of association observed in our
17 study vs. some prior studies. First, our study had a high prevalence of undiagnosed (87%) and untreated
18 (93%) hypertension, which may make this population more comparable to high risk subgroups elsewhere.
19 Second, many prior studies have focused on differences in exposures between-cluster (e.g., between-city)
20 rather than within-cluster. Estimates of association between vs. within cluster may be susceptible to
21 different biases and thus provide different insights into the true effect of PM_{2.5} exposure on BP. Third,
22 published studies have used a range of approaches to estimate air pollution exposures, including satellite-
23 based methods with relatively coarse spatial resolution (10 × 10 km)^{10,11}. Satellite-based methods may
24 have limited ability to estimate small-area variations in air pollution exposures and may have larger
25 exposure measurement error than the LUR models, leading to smaller health effects estimates.⁴⁴ Fourth,
26 differences in particle composition and toxicity may contribute to apparent heterogeneity across studies.

1
2 Few studies have investigated the relationship between middle- or long-term exposure to BC (or PM_{2.5}
3 absorbance, comparable to BC) and BP.^{16,17,44–47} All were conducted either exclusively in urban areas
4^{16,17,47} or in the USA and in older (mostly men) adults (~70 to 80 years).^{44–46} Although results were
5 heterogeneous, they indicated positive associations between ambient BC and BP. Our lack of association
6 is surprising, particularly because the BC LUR model had better performance and captured more local
7 spatial variability compared to the PM_{2.5} LUR model.³¹ A possible explanation is that ambient BC in this
8 setting has a different toxicological profile compared to settings where it is dominated by traffic.^{16,17,45–48}
9 Further studies are needed to explore the role of ambient BC in cardiovascular health in LMICs, perhaps
10 with greater emphasis on source apportionment and composition or toxicity of particles.

11
12 The biological mechanisms linking BP and air pollution likely differ according to PM_{2.5} constituents,
13 timing and duration of exposure, and underlying susceptibility of individuals.^{6,49} Current knowledge
14 indicates that inhaled particles can acutely induce pulmonary oxidative stress and inflammation, and also
15 provoke an initial imbalance in the autonomic nervous system, stimulating the sympathetic response, and
16 subsequently elevating BP due to an increase in arterial vasoconstriction.^{6,8} Long-term PM exposures can
17 also trigger endothelial injury or dysfunction, perhaps driven by an increase in reactive oxygen species,
18 and thus adversely alter systemic hemodynamics and increase risk of hypertension.^{6,8,49}

19
20 Our study overcomes several limitations of previous studies. We collected demographic data for ~100%
21 of all living residents of the study villages (Figure S1). Adults (≥ 18 years) surveyed (n=63128) are
22 similar to our adult study participants in terms of age (mean age of 38 years in both the general
23 population and participants), sex (51% vs. 54% men), and education (47% vs. 53% without education;
24 with slightly more women without education in our study sample) (Table S4). Participants are therefore
25 considered to be representative of the general population of this peri-urban area in South India. Regarding
26 exposure assessment, LUR models provide finer spatial resolution and likely lower exposure

1 measurement error compared with exposure estimates derived solely from satellite imagery or proximity
2 of residence to fixed-site monitoring stations. Limitations of our study, however, should be considered
3 while interpreting the results. Because of the cross-sectional design, we could not ensure exposure
4 preceded the outcome or investigate the influence of timing of exposure on BP. There were a few years
5 between the BP measurement (2010-2012) and the air pollution monitoring campaign (2015-2016),
6 although geographic predictors used in LUR models were from 2012-2013. We assume that the spatial
7 pattern of sources in the study area remained constant between 2010 and 2015. Previous research supports
8 this assumption in settings dominated by traffic sources;⁵⁰ but no comparable evidence is available for
9 peri-urban or rural areas. Although we considered a wide range of potential individual and household
10 confounding factors, we cannot rule out the possibility of unmeasured confounding in the observed
11 associations. Nonetheless, our model formulation allowed separating between and within village effects,
12 thus accounting for factors that may vary across villages (e.g., exposure to other co-pollutants linked to
13 high BP). The fairly wide CIs likely reflect the limited variability of the within-village exposure and/or
14 the random measurement error in the outcome by measuring BP in a single occasion.²⁹

15

16 In conclusion, our study suggests that long-term exposure to ambient fine particulate matter is positively
17 associated with blood pressure in women, independently of the type of fuel used for cooking. Additional
18 epidemiological evidence is needed to corroborate our findings, ideally from studies using longitudinal
19 data, to better inform the potential cardiovascular health benefits of air pollution control policies.

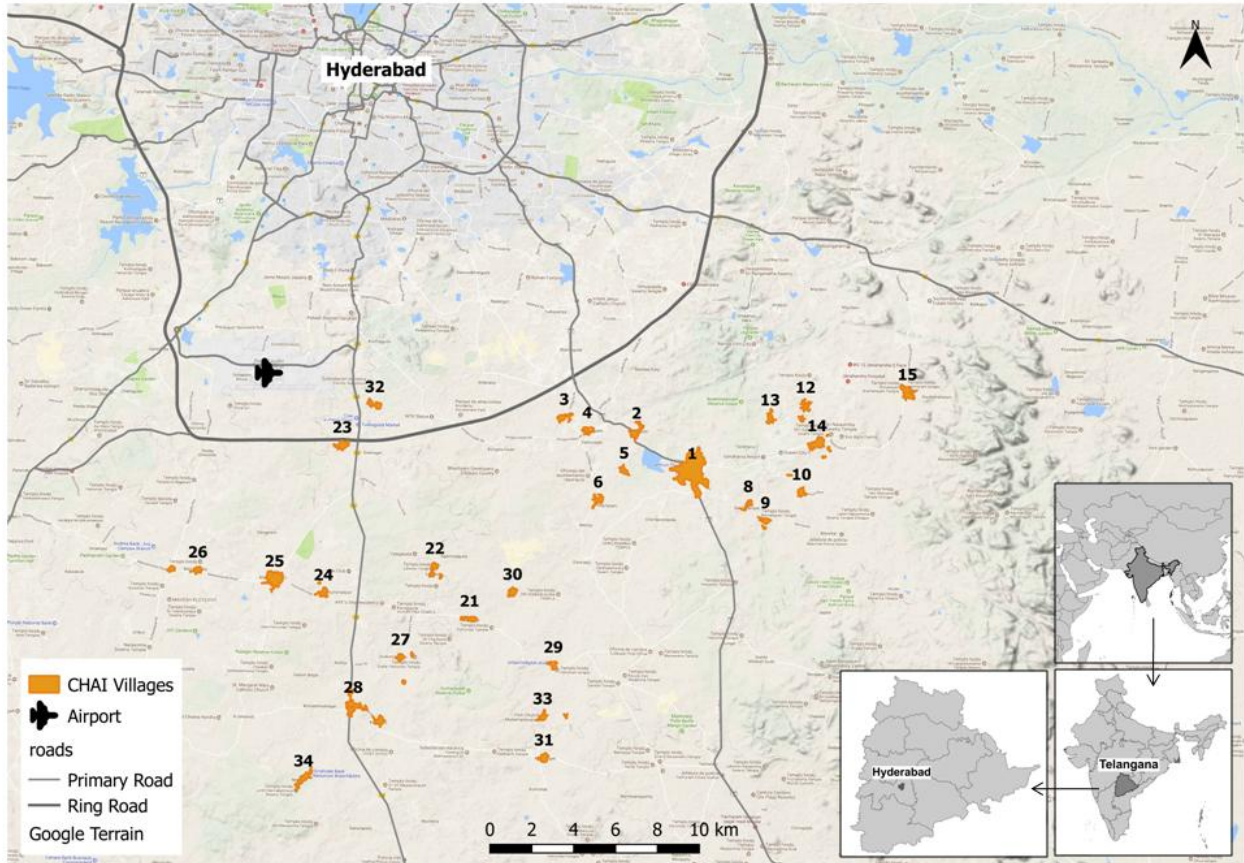
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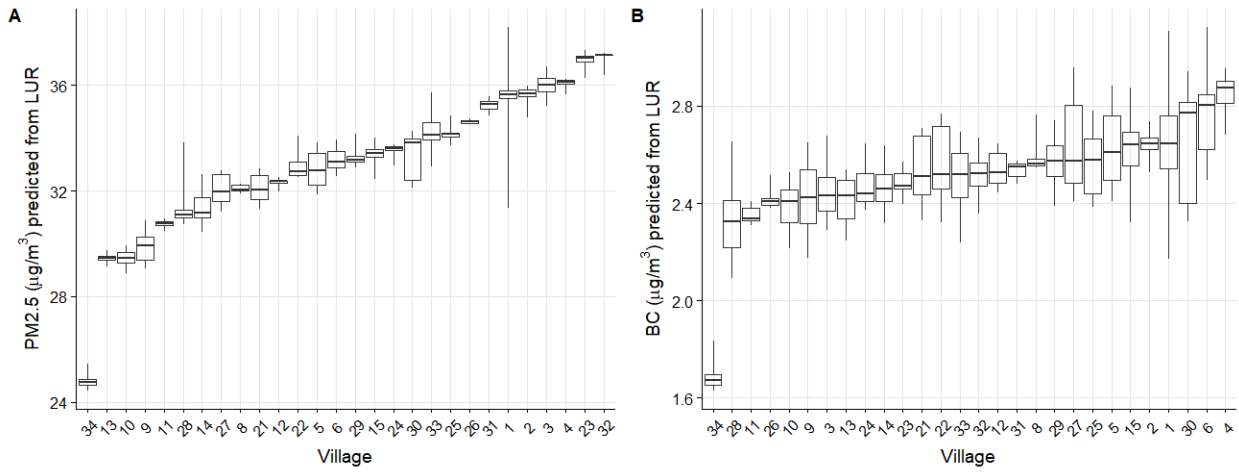
Figure 1 Map of the study area.



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Figure 2 Box plots of estimated PM_{2.5} (panel A) and BC (panel B) at residence according to village.



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PM_{2.5}: particles less than 2.5 µm in diameter; BC: black carbon; LUR: Land-Use Regression model.

1 **Table 1** Participants' characteristics, exposure levels, and blood pressure.

	n (% missing)^a	ALL	MEN	WOMEN
Men; %	5531 (0)	54	-	-
Age (years); mean ± SD	5531 (0)	37.7 ± 13.3	37.3 ± 14.9	38.1 ± 11.3
Formal education; %	5530 (0.02)			
Without (either illiterate or literate)		53	38	70
With any kind		47	62	30
Standard of living index; %	5171 (6.5)			
Low		33	34	38
Medium		33	36	35
High		33	30	27
Physical activity (METs-week); mean ± SD	5235 (5.4)	1.6 ± 0.2	1.6 ± 0.2	1.7 ± 0.2
BMI (kg/m²); mean ± SD	5519 (0.2)	21.1 ± 3.8	20.9 ± 3.6	21.4 ± 4.1
Smoking status; %	5530 (0.02)			
Never		83	68	99
Former (stopped 6 months ago)		1	2	0
Current (within last 6 months)		16	30	0.2
Exposure to ETS at home; %	5530 (0.02)	31	74	63
Alcohol intake frequency; %	5529 (0.04)			
Never		32	20	45
Occasional (monthly or special occasions)		36	35	37
Regular (daily or weekly)		32	44	17
Temperature of the room (°C); mean ± SD	5531 (0)	26.4 ± 2.8	26.3 ± 2.8	26.5 ± 2.8
Salt intake (grams); mean ± SD	5523 (0.1)	6.4 ± 3.4	6.9 ± 3.7	5.8 ± 2.9
Self-reported diabetes; %	5530 (0.02)	2	3	2
Primary cooking fuel; %	5184 (6.3)			
Clean (gas or electricity)		42	43	40
Biomass		58	57	60
Ambient PM_{2.5} (µg/m³); mean ± SD	5531 (0)	32.8 ± 2.7	32.8 ± 2.7	32.9 ± 2.7
Ambient BC (µg/m³); mean ± SD	5531 (0)	2.5 ± 0.2	2.5 ± 0.2	2.5 ± 0.2

SBP (mm Hg); mean ± SD	5531 (0)	120.9 ± 15.9	124.0 ± 16.2	117.8 ± 14.9
DBP (mm Hg); mean ± SD	5531 (0)	79.4 ± 12.5	81.3 ± 12.9	77.7 ± 11.6
Self-reported hypertension; %	5375 (2.8)	6	6	6
Antihypertensive medication; %	5373 (2.9)	3	3	3
Measured hypertension; %	5531 (0)	46	52	39

1 *MET: metabolic equivalent task; BMI: body mass index; ETS: environmental tobacco smoke; SBP:*
2 *systolic blood pressure; DBP: diastolic blood pressure; PM_{2.5}: particles less than 2.5 μm in diameter;*
3 *BC: black carbon; SD: standard deviation*

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5 ^a% missing based on 5531 sample size; % distributions for a given covariate are based on complete cases.

6 Values correspond to data prior to multiple imputation.

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Table 2 Associations between residential exposure to particles and blood pressure according to sex. Changes in SBP and DBP are expressed as unit increase in mm Hg per 1 $\mu\text{g}/\text{m}^3$ increase in $\text{PM}_{2.5}$ and per IQR increase in BC ($=0.1 \mu\text{g}/\text{m}^3$).

	MEN (n=2979)				WOMEN (n=2552)			
	SBP		DBP		SBP		DBP	
	β	95% CI	β	95% CI	β	95% CI	β	95% CI
PM_{2.5}								
Crude	0.73	-0.68 to 2.14	0.55	-0.60 to 1.69	1.24	-0.16 to 2.65	0.79	-0.29 to 1.88
Model 1	0.71	-0.65 to 2.08	0.52	-0.61 to 1.65	1.61	0.30 to 2.93	1.03	-0.01 to 2.08
Model 2	0.80	-0.56 to 2.16	0.60	-0.53 to 1.72	1.62	0.30 to 2.93	1.04	-0.01 to 2.08
Model 3	0.52	-0.82 to 1.85	0.41	-0.69 to 1.52	1.43	0.12 to 2.74	0.87	-0.18 to 1.91
Model 4	0.42	-0.86 to 1.71	0.31	-0.74 to 1.36	1.46	0.19 to 2.73	0.91	-0.08 to 1.89
BC								
Crude	-0.40	-1.11 to 0.31	-0.17	-0.74 to 0.41	-0.07	-0.79 to 0.64	-0.01	-0.56 to 0.55
Model 1	-0.23	-0.91 to 0.46	-0.07	-0.63 to 0.50	0.20	-0.47 to 0.86	0.17	-0.36 to 0.69
Model 2	-0.21	-0.90 to 0.47	-0.06	-0.62 to 0.51	0.20	-0.46 to 0.87	0.17	-0.36 to 0.70
Model 3	-0.20	-0.86 to 0.47	-0.04	-0.59 to 0.51	0.15	-0.52 to 0.81	0.11	-0.41 to 0.64
Model 4	-0.27	-0.91 to 0.37	-0.12	-0.64 to 0.41	0.01	-0.64 to 0.65	-0.03	-0.53 to 0.47

6 *PM_{2.5}: particles less than 2.5 μm in diameter; BC: black carbon; SBP: systolic blood pressure; DBP:*
7 *diastolic blood pressure; IQR: inter-quartile range; CI: confidence interval.*

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9 **Model 1** (basic): adjusted for age, antihypertensive medication, and mean village concentration

10 **Model 2** (cooking fuel adjusted): model 1 + cooking fuel

11 **Model 3** (main): model 2 + education attainment, standard of living index, physical activity,
12 environmental tobacco smoke, active smoking (only in men), alcohol, room temperature, and salt intake

13 **Model 4** (including potential mediators): model 3 + body mass index and diabetes

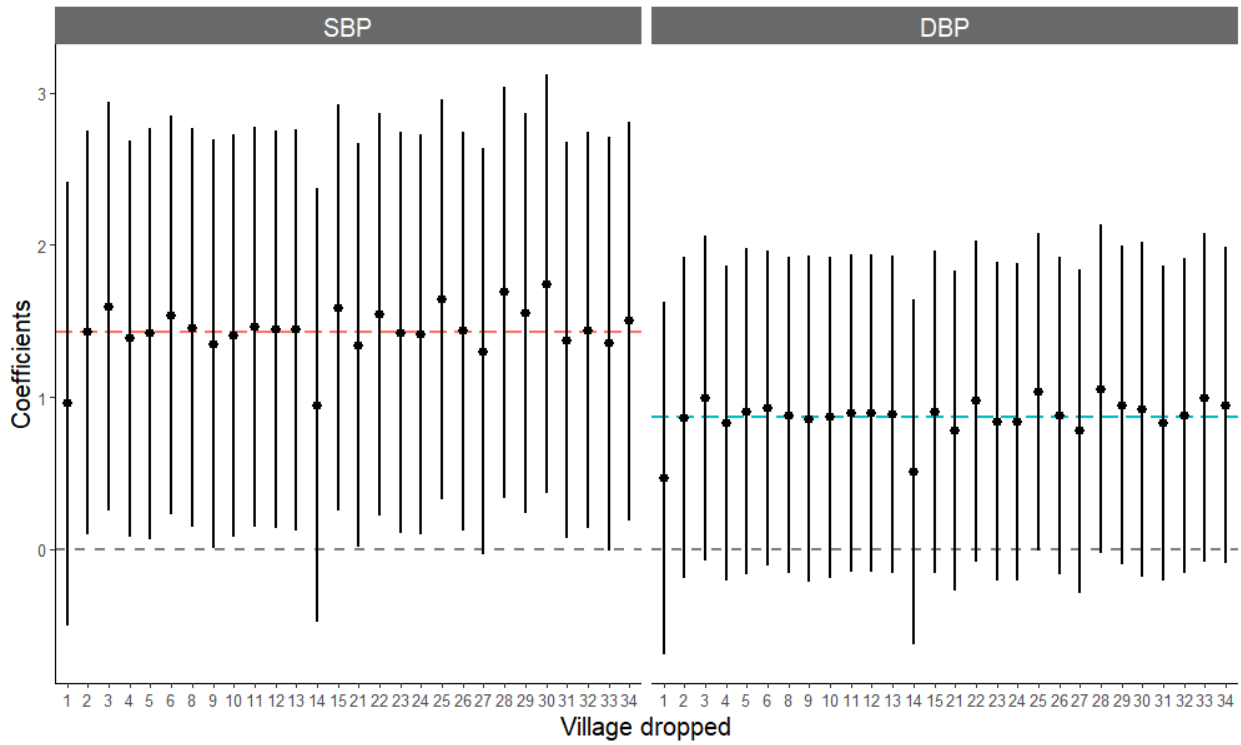
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Figure 3 Regression coefficients for the association between fine particulate matter (PM_{2.5}) and blood pressure in women after the leave-one-village-out approach.



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Error bars represent 95% Confidence Interval. Dashed black line corresponds to the zero level. Red dashed line corresponds to the systolic blood pressure (SBP) coefficient from the model considering all villages (shown for reference), whereas blue dashed line corresponds to diastolic blood pressure (DBP) coefficient.

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