1	RENIN-ANGIOTENSIN-ALDOSTERONE SYSTEM BLOCKERS ARE NOT ASSOCIATED
2	WITH CORONAVIRUS DISEASE 2019 (COVID-19) HOSPITALISATION: STUDY OF 1439
3	UK BIOBANK CASES
4	
5	RUNNING TITLE: RENIN-ANGIOTENSIN SYSTEM BLOCKERS AND COVID-19
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24 ABSTRACT

Background: Cardiometabolic morbidity and medications, specifically Angiotensin Converting Enzyme inhibitors (ACEi) and Angiotensin Receptor Blockers (ARBs), have been linked with adverse outcomes from coronavirus disease 2019 (COVID-19). This study aims to investigate, factors associated with COVID-19 positivity in hospital for 1,436 UK Biobank participants; compared with individuals who tested negative, and with the untested, presumed negative, rest of the cohort.

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Methods: We studied 7,099 participants from the UK Biobank who had been tested for COVID-19 in hospital. We considered the following exposures: age, sex, ethnicity, body mass index (BMI), diabetes, hypertension, hypercholesterolaemia, ACEi/ARB use, prior myocardial infarction (MI), and smoking. We undertook comparisons between 1) COVID-19 positive and COVID-19 negative tested participants; and 2) COVID-19 tested positive and the remaining participants (tested negative plus untested, n=494,838). Logistic regression models were used to investigate univariate and mutually adjusted associations.

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Results: Among participants tested for COVID-19, Black, Asian, and Minority ethnic (BAME) ethnicity, male sex, and higher BMI were independently associated with a positive result. BAME ethnicity, male sex, greater BMI, diabetes, hypertension, and smoking were independently associated with COVID-19 positivity compared to the remining cohort (test negatives plus untested). However, similar associations were observed when comparing those who tested negative for COVID-19 with the untested cohort; suggesting that these factors associate with general hospitalisation rather than specifically with COVID-19.

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47 Conclusions: Among participants tested for COVID-19 with presumed moderate to severe symptoms
48 in a hospital setting, BAME ethnicity, male sex, and higher BMI are associated with a positive result.
49 Other cardiometabolic morbidities confer increased risk of hospitalisation, without specificity for
50 COVID-19. ACE/ARB use did not associate with COVID-19 status.

51

Keywords: coronavirus disease 2019; UK Biobank; ethnicity; sex; obesity; cardiometabolic disease;
 Angiotensin Converting Enzyme inhibitors; Angiotensin Receptor Blockers

54 INTRODUCTION

Coronavirus disease 2019 (COVID-19), the clinical illness caused by the severe acute respiratory 55 syndrome coronavirus 2 (SARS-CoV-2), has reached pandemic levels. There has been growing 56 recognition that patients with underlying cardiometabolic morbidities may be suffering higher rates of 57 infection and a more severe disease course than the general population¹⁻³. Debate has ensued regarding 58 whether these observations relate to the conditions themselves or the medications with which they are 59 60 treated. In particular, some have suggested a mechanistic role for Angiotensin Converting Enzyme inhibitors (ACEi) or Angiotensin Receptor Blockers (ARBs)⁴. However, recent reports have not 61 produced convincing evidence for the specific association of ACEi/ARBs with poorer outcomes⁴⁻⁶. 62 Cardiometabolic diseases are common and ACEi/ARBs are used by many vulnerable patients. It is 63 therefore important to better understand the augmented risk associated with cardiometabolic factors and 64 ACEi/ARB use with COVID-19, to inform clinical practice, and guidance to patients. 65

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The UK Biobank (UKB) is a large cohort study comprising data from over 500,000 participants from across the UK, characterised in detail at baseline (2006-2010), and with linkages to Hospital Episode Statistic (HES) data. In response to the COVID-19 pandemic, the UKB facilitated rapid release of COVID-19 testing data for its participants through linkage with Public Health England⁷, providing a unique opportunity to study the effects of many well-defined exposures on COVID-19 status.

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73 The aim of this study is to investigate the association of demographic factors (age, sex, ethnicity), 74 cardiometabolic profile [body mass index (BMI), diabetes, hypertension, hypercholesterolaemia, prior

75 myocardial infarction (MI), smoking], and ACEi/ARB use with COVID-19 positivity in hospital using

76 data from UKB.

77 METHODS

78 Setting and study population

UKB is a prospective cohort study including over 500,000 participants from across the UK. Individuals 79 aged 40-69 years old identified via National Health Service (NHS) registers were recruited over a four-80 year period between 2006-2010. Participants underwent detailed baseline assessment including 81 characterisation of socio-demographics, lifestyle, medical history, and a series of physical measures. 82 The protocol is publicly available⁸. Linkages with HES data permit longitudinal tracking of health 83 84 outcomes for all participants with conditions recorded according to international classification of disease (ICD) codes. In addition, UKB has produced algorithmically defined outcome data for incidence 85 of key illness, such as MI, through integration of data from multiple sources⁹. The latest data release 86 (24th June 2020) includes test results from 16th March to 14th June. In the UK, until the 18th of May 87 2020, testing was almost entirely limited to hospital settings, after this date, testing was extended to the 88 community. Therefore, we consider a positive test performed up to the 18th of May as indicative of 89 hospitalisation, beyond this date we required explicitly labelling of the sample as "inpatient". Testing 90 91 was based on a real-time polymerase chain reaction (RT-PCR) assay antigen test; for most participants 92 the sample tested was from combined nose and throat swab; for patients in intensive care lower 93 respiratory samples may have been used. Thus, we defined a cohort of participants who were tested for 94 SARS-CoV-2 whilst admitted to hospital, and therefore are likely to have a relatively severe presentation. 95

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97 Ethics

This study was covered by the ethics approval for UKB studies from the NHS National Research Ethics
Service on 17th June 2011 (Ref 11/NW/0382) and extended on 10th May 2016 (Ref 16/NW/0274).

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101 Statistical analysis

Statistical analysis was performed using R Version 3.6.2 [R Core Team (2019). R: A language and 102 environment for statistical computing. R Foundation for Statistical Computing, Vienna, Austria. 103 104 URL https://www.R-project.org/], and RStudio Version 1.2.5019 [RStudio Team (2015). RStudio: Integrated Development for R. RStudio, Inc., Boston, MA URL http://www.rstudio.com/]. We 105 considered the following exposures: age, sex, ethnicity, body mass index (BMI), diabetes, hypertension, 106 high cholesterol, ACEi/ARB use, prevalent MI, and smoking. The cardiometabolic and demographic 107 factors were selected based on existing reports of their potential association with COVID-19 108 outcomes^{3,10,11}. ACEi/ARBs were considered due to reports of potential mechanistic role of these 109 medications in the clinical course of COVID-19⁴. We used age, sex, and ethnicity (White vs BAME) 110

111 as recorded at baseline. BMI was calculated from height and weight recorded at baseline. Smoking 112 status was based on self-report. Hypertension, diabetes, and hypercholesterolaemia were defined 113 through cross-checking across self-report and HES data. A list of ICD codes used is available in Supplementary Table 1. Information on prior MI was obtained from the UKB algorithmically defined 114 115 health outcomes. ACEi/ARB use was determined from self-report (Supplementary Table 2). We considered the effect of ACEi and ARBs both separately and as an aggregate variable. We created three 116 cohorts: test positives, test negatives, and the untested cohort (Figure 1). Individuals who were tested, 117 but with unclear hospitalisation status were excluded from the analysis. We firstly compared the 118 COVID-19 test positive cohort with the combined cohort of test negatives and the untested UKB 119 population. In order to investigate possible bias relating to hospitalisation status, we also considered the 120 importance of these exposure variables in two further comparisons: test positives vs test negatives and 121 test negatives vs untested population. We used logistic regression models to elucidate univariate and 122 123 then multivariate associations. There was no evidence of multicollinearity with inflation factor (VIF) <2.0 for all covariates. As the observed association with ethnicity was strong, we tested for potential 124 interaction effects between ethnicity and all tested covariates in multivariate models. We present odds 125 ratio (OR) for each exposure with the corresponding 95% confidence interval (CI) and p-value. Given 126 the low background prevalence of COVID-19 positivity, the odds ratios can be interpreted as relative 127 128 risks.

129 **RESULTS**

130 **Baseline characteristics**

131 Of the 7,668 UKB participants tested for COVID-19, 7,099 were likely in a hospital setting and are

included in this analysis (Table 1, Figure 1), of these 1,439 tested positive and 5,660 tested negative.

133 There was no record of testing for the remainder of the UKB cohort (n=494,838) (Figure 1).

134

In comparison to the untested cohort, the COVID-19 positive cohort were predominantly male (52.9% vs 45.5%), had a greater proportion of BAME individuals (12.9% vs 5.3%), and an all-round poorer cardiometabolic profile, with higher BMI, higher rates of smoking, prior MI, diabetes, hypertension, and high cholesterol; they also reported greater use of ACEi/ARB agents (21.8% vs 14.3%). However, comparing the COVID-19 positive cohort with the tested negative cohort (n=5,660), the differences were much less pronounced, as the test negative cohort also had a globally poorer cardiometabolic profile than the untested population.

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143 Association of exposures with COVID status

144 COVID-19 positive vs not COVID-19 positive (tested negative cohort <u>plus</u> untested cohort)

We first tested whether there were univariate associations between exposures and COVID-19 positives (n=1,439) vs not COVID-19 positives (including tested negative and untested cohort, n=500,498). Univariate associations were significant for all covariates considered, except age. In multivariate models, the independent predictors of COVID-19 positivity were younger age, male sex, BAME ethnicity, greater BMI, diabetes, hypertension, and smoking (Table 2, Figure 2: Comparison 1).

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151 COVID-19 positive vs COVID-19 tested negative

152 We next considered associations between exposures and COVID-19 positives (n=1,439) vs tested 153 negative cohort (n=5,660). Within this sample, the univariate predictors of positivity were male sex, 154 younger age, BAME ethnicity, greater BMI, and diabetes. These variables, with the exception of diabetes, remained statistically significant in the multivariate model with mutual adjustment for all other 155 156 covariates (Table 2, Figure 2). The greatest magnitude of effect related to ethnicity; BAME individuals had almost twice the likelihood of a COVID-19 positive result compared to White ethnicities in the 157 fully adjusted models [OR 1.95, 95% CI (1.60, 2.36)]. There was no evidence of interaction effect with 158 ethnicity and any of the other covariates (Supplementary Table 3). Compared with women, men had 159 22% greater odds of a COVID-19 positive test [OR 1.22, 95% CI (1.08, 1.38)]. For every 5kg/m² 160 increase of BMI, there was 9% greater odds of COVID-19 positive status (Table 2, Figure 2: 161

162 Comparison 2). There was a negative association with age, this may reflect older age of participants 163 admitted to hospital for reasons other than COVID-19; alternatively, it may be an artefact of the data 164 related to the narrow age range in the sample. Notably, there was no significant association between 165 ACEi/ARB use and COVID-19 status, which was consistent when testing effect of ACEi and ARBs 166 separately (Supplementary Table 4).

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168 COVID-19 tested negatives vs untested population

- 169 Finally, we investigated associations between the exposures with a negative test (n=5,660) vs untested
- 170 UKB population (n=494,838). There were significant univariate associations for all covariates

171 considered. In the multivariate model, BAME ethnicity, older age, higher BMI, diabetes, hypertension,

- high cholesterol, previous MI, and smoking were significant predictors of a having a negative test, and
 therefore of presenting to hospital, perhaps with respiratory symptoms, compared to not being tested
- 174 (Table 2, Figure 2: Comparison 3).

175 **DISCUSSION**

176 Summary of findings

In this analysis of 7,099 UKB participants tested for COVID-19 in a hospital setting, BAME ethnicity, 177 younger age, male sex, greater BMI, diabetes, hypertension, and smoking were independently 178 associated with COVID-19 positive test in comparison to the rest of the cohort (tested negatives plus 179 untested). However, within the tested sample, a positive result was more likely for men, BAME 180 individuals, younger ages, and with greater BMI. Indeed, when compared with the background 181 182 population, the pattern of associations between exposures and COVID-19 positive was similar to that for COVID-19 test negative. These findings suggest that BAME ethnicity, male sex, and higher BMI 183 have specific relevance to COVID-19, whilst the other exposure associations between COVID-19 184 185 positive and the remainder of the population reflect morbidities associated with general requirement for 186 hospitalisation, without specificity to COVID-19. Furthermore, as testing was in a hospital setting, these associations relate specifically to the more severe end of the COVID-19 manifestations requiring 187 188 hospitalisation. Notably, ACEi/ARB usage was not associated with COVID-19 status.

189

190 **Comparison with existing literature**

With the rapid global spread of COVID-19, understanding the determinants of infection risk and 191 192 severity is a priority. Differences in ethnic background are known to contribute to differences in patterns of a number of diseases, including influenza¹², due to different genetic susceptibilities and 193 environmental exposures¹³. In the UK, national audit data demonstrates as many as one-third of 194 195 COVID-19 patients admitted to intensive care are from BAME backgrounds; a rate which is disproportionate to their representation among the general UK population¹⁴. In our study, BAME 196 ethnicity had specific association with higher risk of COVID-19 positive status that appeared 197 independent from often-quoted confounders of cardiovascular and metabolic morbidity that are known 198 to be higher in prevalence in BAME cohorts¹⁵. Having accounted for cardiometabolic morbidity, the 199 possible explanations for this association remain numerous¹⁶, gravitating around both genetic and social 200 factors; behavioural, cultural, and socioeconomic differences, including health-seeking behaviour and 201 intergenerational cohabitation are all likely to play a role in the strong disparity observed in our study, 202 providing key targets for both further research and public health policy. Initial studies, demonstrate 203 204 complex interplay of biological and socio-economic factors and highlight need for urgent research in this area¹⁷. 205

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207 Since the first reports emerging from China at the beginning of the outbreak, it has been widely 208 recognized that males suffer higher rates of infection and poorer outcomes compared to females; with

reported distributions of approximately three-fifths men and two-fifths women^{18,19}. The reasons for this 209 210 are unclear. Animal studies demonstrate, that in mice infected with SARS-CoV, oestrogen-deplete 211 status either due to male gender or ovariectomy is associated with higher risk of acute respiratory 212 distress syndrome (ARDS), indicating a possible protective role of oestrogen signalling²⁰. Men are known to have higher burden of cardiovascular disease than women up to the perimenopausal years; 213 and thus, lower cardiometabolic morbidity among women in the younger cohort has been postulated to 214 contribute to better outcomes. However, we demonstrate that in our study population, the association 215 between male sex and higher infection rates was independent of cardiometabolic disease. Furthermore, 216 male sex appears significant in our sample comprising an older cohort with almost all women being 217 post-menopause, indicating that sex-differential disparities in COVID-19 disease severity relate to 218 factors other than immediate-term oestrogen exposure. Thus, our findings suggest that the higher risk 219 of COVID-19 in men is not sufficiently explained by the oestrogen pathway or greater burden of 220 221 cardiometabolic disease.

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223 Obesity is a global health issue, rising in prevalence and public health burden in both developed and developing countries. Patients who suffer from obesity are known to be at increased risk of a number 224 225 of conditions, including cardiometabolic and respiratory disease, contributing to a poor physiological reserve. It is already known that patients with obesity have worse outcomes from influenza infection^{21,22}. 226 With the wealth of emerging research on COVID-19, concern has grown over the association between 227 obesity and poor outcomes of infection²³; with studies consistently demonstrating higher rates of critical 228 or intensive care requirement among individuals with higher BMI²⁴⁻²⁶. Similar to ethnicity, the 229 relationship between obesity and severe infection must be isolated from the confounding of obesity-230 related comorbidity. In our study, we demonstrate the distinct role of obesity from that of associated 231 232 cardiometabolic diseases; with the major finding that obesity, and not its comorbidities, had 233 independent and specific association with COVID-19 positivity. This is of important relevance, as mechanistic understanding of the reason behind this association may provide therapeutic insight. For 234 235 example, obesity enhances risk of thrombosis, which has been a recent focus of interest given concern over a possible association between COVID-19 and prothrombotic intravascular coagulation²⁷. The 236 results of our study provide useful information for risk stratification of patients, highlight important 237 avenues for further research, and emphasise the public health-level importance of continued targeting 238 239 of obesity.

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241 Several reports hypothesise potential mechanistic links between ACEi/ARB usage and adverse 242 outcomes from COVID-19⁴. SARS-CoV-2 has been shown to exhibit specific tropism for the 243 angiotensin-converting enzyme 2 (ACE2) receptor; by which means it enters the cells and establishes

itself in the host²⁸. The expression of ACE2 receptors in epithelial cells of the lung, intestine, kidney 244 245 and endothelium may be increased in those treated with ACEi/ARBs, thereby facilitating entry and multisystem manifestations of COVID-19^{29,30}. The relationship between COVID19 infection risk and 246 use of ACEi/ARBs has been a matter of debate since the early days of the outbreak, but recent studies 247 248 have revealed a lack of independent association when morbidity variables, including atherosclerotic cardiovascular disease, heart failure and cardiometabolic diseases such as diabetes and hypertension 249 were accounted for^{4,5}. Furthermore, a recent study from Spain demonstrates no association between 250 ACEi/ARB use and COVID-19 mortality or requirement for intensive care³¹. Findings from our sample 251 are consistent with these reports, demonstrating univariate association with ACEi/ARB use which 252 253 becomes non-significant after adjustment for cardiometabolic and demographic factors.

254

255 Strengths and Limitations

UKB is a comprehensive data source, incorporating a large sample with linkages to prospectively 256 tracked health outcomes recorded in a standardised manner using ICD codes, enabling reliable and up-257 to-date definition of morbidities. The rapid release of COVID-19 testing data provides a huge 258 259 opportunity to examine association of a large number of exposures with COVID-19 status and outcomes. Due to the observational study design, we cannot comment on causal relationships from the 260 results, however, the prospective nature of the study ensures confident temporal separation of exposure 261 262 and outcome. Whilst analyses using the whole UK Biobank cohort of over 500,000 people may detect 263 very small associations which are unlikely to be clinically significant, we studied a subset of much more 264 modest sample size, with exposures and covariates chosen on the basis of prior literature and biological 265 plausibility with the magnitude of relationships observed likely to be clinically meaningful. Further research in different cohorts would be helpful in better understanding the impact of the exposures 266 267 studied. Whilst we can be reasonably confident about hospitalisation status of the tested cohort in this study, there is uncertainty about the degree of symptoms. We acknowledge that there are local variations 268 in testing approaches and that conclusions regarding disease severity drawn from hospitalisation status 269 270 alone have limitations. Studies in cohorts with more granular outcome data are needed. Furthermore, our results cannot be generalisable to asymptomatic or mildly symptomatic patients. 271

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273 Conclusions

This work highlights specific associations of BAME ethnicity, male sex, and higher BMI with COVID-19 positive status, which were independent of other demographic or cardiometabolic factors. More detailed characterisation of these associations in larger and more diverse cohorts is warranted, particularly with regards ethnicity. Investigation of potential biological pathways underlying these observed associations may provide insight into the mechanisms by which SARS-CoV-2 causes disease
 enabling more informed pursuit of potential therapeutic targets.

280

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294 FIGURE LEGENDS

- 295 Figure 1 Title: Summary of COVID-19 testing and results for UK Biobank participants
- Figure 1 legend: Data includes COVID-19 test results from 16/03/2020 to 14/06/2020. During this
- time period, 7,688 participants, of the whole UK Biobank cohort (n=502,506) have been tested for
- 298 COVID-19. 7,099 were likely in a hospital setting, of whom 1,439 participants had a positive result and
- 299 5,660 tested negative. The remaining participants (n=494,838) have not been tested.
- 300
- 301 Figure 2 Title: Odds Ratios and 95% confidence intervals for each exposure from the multivariate
- 302 logistic regression models in the three different comparisons*
- 303 Figure 2 legend: *Comparison 1: COVID-19 positive (n=1,439) vs not COVID-19 positive (tested
- negative <u>plus</u> untested cohort) (n=494,838); Comparison 2: COVID-19 positive (n=1,439) vs COVID-
- 305 19 test negative (n=5,660); Comparison 3: COVID-19 test negative (n=5,660) vs untested population
- 306 (n=494,838). Results are odds ratios with 95% confidence intervals. Dashed lines represent non-
- 307 significant and solid lines statistically significant results, with threshold at p<0.05.

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 404 doi: 10.1016/S0140-6736(20)31030-8.
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Table 1 caption: Data are n (%), mean (standard deviation), or median [interquartile range]. COVID19 data includes test results from 16/03/2020 to 14/06/2020 from hospital settings. *We report age of
participants as of 01/04/2020. **smoking includes current and previous smoking. [†]ACEi/ARB use is
defined as a binary measure, defined as true if record of any of medications in supplementary Table 2.
ACEi: Angiotensin Converting Enzyme inhibitor; ARB: Angiotensin Receptor Blocker; BAME: Black,
Asian, and Minority ethnic; BMI: body mass index; COVID-19: coronavirus 2019.

Table 1. Baseline participant characteristics

	COVID-19 tested (n=7,099)	COVID-19 positive (n=1,439)	COVID-19 negative (n=5,660)	Untested population (n=494,838)
Sex (Male)	3,525 (49.7%)	761 (52.9%)	2,764 (48.8%)	225,352 (45.5%)
Age*	69.11 (± 8.65)	68.22 (± 9.19)	69.34 (± 8.49)	68.24 (± 8.10)
White ethnicity	6,498 (91.5%)	1,242 (86.3%)	5,256 (92.9%)	465,681 (94.1%)
BAME ethnicity	562 (7.9%)	185 (12.9%)	377 (6.7%)	26,429 (5.3%)
BMI (kg/m ²)	27.66 [24.78, 31.13]	27.97 [25.18, 31.50]	27.58 [24.69, 31.02]	26.7 [± 24.13, 29.89]
Smoking**	3,663 (51.6%)	732 (50.9%)	2,931 (51.8%)	221,478 (44.8%)
Prior MI	557 (7.8%)	103 (7.2%)	454 (8.0%)	20,227 (4.1%)
Diabetes	1,029 (14.5%)	241 (16.7%)	788 (13.9%)	38,046 (7.7%)
Hypertension	3,338 (47.0%)	676 (47.0%)	2,662 (47.0%)	171,415 (34.6%)
High cholesterol	2,388 (33.6%)	477 (33.1%)	1,911 (33.8%)	115,133 (23.3%)
ACEi	1,117 (15.7%)	227 (15.8%)	890 (15.7%)	50,635 (10.2%)
ARB	418 (5.9%)	87 (6.0%)	331 (5.8%)	20,416 (4.1%)

416	Table 2 caption:	^{**} Comparison 1: CC	OVID-19 positive (n=1	1,439) vs not COVID-19	9 positive (tested
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- 417 negative plus untested cohort) (n=494,838); Comparison 2: COVID-19 positive (n=1,439) vs COVID-
- 418 19 test negative (n=5,660); Comparison 3: COVID-19 test negative (n=5,660) vs untested population
- 419 (n=494,838). Results are odds ratio, 95% confidence interval, and p-value (from top to bottom) for
- 420 each exposure. For continuous variables (age, BMI) coefficients refer to the effect on odds of the
- 421 outcome per five unit increase in the exposures, i.e. 5-year increase in age and 5kg/m² increase in
- 422 BMI. The remaining exposures are set as binary measures with results showing effect of change from
- 423 non-disease to disease states, male sex vs female sex, BAME ethnicity vs White ethnicity; smoking
- 424 history (current/previous) vs never smoked; ACEi/ARB use vs no ACEi/ARB use on odds of the
- 425 outcome. *indicates p-values <0.05. ACEi: Angiotensin Converting Enzyme inhibitor; ARB:
- 426 Angiotensin Receptor Blocker; BMI: body mass index; coronavirus 2019: COVID-19; BAME: Black,
- 427 Asian, and Minority ethnic; MI: myocardial infarction.
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Table 2. Odds Ratios, 95% confidence intervals, and p-values for each exposure from univariate and multivariate logistic regression models in the three defined comparisons**

	Comparison 1		Comparison 2		Comparison 3	
Predictors	Univariate Models	Multivariate Model	Univariate Models	Multivariate Model	Univariate Models	Multivariate Model
Male sex	1.34* [1.21, 1.49]	1.19* [1.07, 1.32]	1.18* [1.05, 1.32]	1.22* [1.08, 1.38]	1.14* [1.08, 1.20]	1.00 [0.95, 1.06]
	3.07×10 ⁻⁸	0.0017	0.0061	0.0012	7.68×10 ⁻⁷	0.9759
Age (per 5 years)	1.00 [0.97, 1.03]	0.96* [0.93, 1.00]	0.93* [0.90, 0.96]	0.94* [0.90, 0.97]	1.09* [1.07, 1.11]	1.03* [1.01, 1.05]
	0.8620	0.0316	1.17×10 ⁻⁵	9.64×10 ⁻⁴	5.81×10 ⁻²⁴	0.0013
BAME ethnicity	2.62* [2.23, 3.05]	2.47* [2.10, 2.89]	2.08* [1.72, 2.50]	1.95* [1.60, 2.36]	1.26* [1.14, 1.40]	1.27* [1.14, 1.41]
	4.58×10 ⁻³⁴	5.58×10 ⁻²⁸	1.59×10 ⁻¹⁴	2.07×10 ⁻¹¹	1.29×10 ⁻⁵	1.70×10 ⁻⁵
BMI (per 5kg/m2)	1.30* [1.24, 1.36]	1.19* [1.13, 1.25]	1.10* [1.04, 1.16]	1.09* [1.03, 1.16]	1.19* [1.16, 1.22]	1.09* [1.06, 1.12]
	2.19×10 ⁻²⁹	7.63×10 ⁻¹¹	3.62×10-4	0.0031	4.47×10 ⁻⁴²	3.78×10 ⁻⁹
Diabetes	2.39* [2.08, 2.74]	1.52* [1.29, 1.79]	1.24* [1.06, 1.45]	1.17 [0.98, 1.41]	1.94* [1.80, 2.09]	1.34* [1.23, 1.46]
	7.39×10 ⁻³⁵	3.72×10 ⁻⁷	0.0066	0.0882	1.05×10^{-65}	2.80×10 ⁻¹¹
Hypertension	1.66* [1.50, 1.84]	1.25* [1.09, 1.43]	1.00 [0.89, 1.12]	0.98 [0.84, 1.14]	1.68* [1.59, 1.77]	1.28* [1.20, 1.37]
	8.27×10 ⁻²²	0.0010	0.9704	0.7727	1.27×10 ⁻⁸²	5.90×10 ⁻¹³
High cholesterol	1.62* [1.45, 1.81]	1.12 [0.97, 1.28]	0.97 [0.86, 1.10]	0.95 [0.81, 1.11]	1.68* [1.59, 1.78]	1.19* [1.11, 1.27]
	5.20×10 ⁻¹⁸	0.1234	0.6592	0.5006	3.31×10 ⁻⁷⁵	1.52×10^{-6}
ACEi/ARB	1.65* [1.45, 1.87]	1.04 [0.89, 1.22]	1.01 [0.88, 1.17]	0.99 [0.83, 1.19]	1.64* [1.54, 1.75]	1.04 [0.96, 1.13]
	7.54×10 ⁻¹⁵	0.5885	0.8563	0.9468	2.31×10 ⁻⁵¹	0.3193
Prior MI	1.79* [1.45, 2.17]	1.18 [0.94, 1.46]	0.88 [0.70, 1.10]	0.85 [0.66, 1.08]	2.05* [1.85, 2.25]	1.39* [1.25, 1.54]
	1.41×10 ⁻⁸	0.1377	0.2770	0.1893	1.70×10^{-47}	1.02×10^{-9}
Smoking	1.27* [1.15, 1.41]	1.26* [1.13, 1.40]	0.96 [0.86, 1.08]	1.02 [0.90, 1.15]	1.33* [1.26, 1.40]	1.24* [1.17, 1.31]
	4.58×10 ⁻⁶	3.02×10 ⁻⁵	0.5348	0.7369	5.91×10 ⁻²⁶	9.40×10 ⁻¹⁵