## Articles

# Ethnic differences in SARS-CoV-2 infection and COVID-19related hospitalisation, intensive care unit admission, and death in 17 million adults in England: an observational cohort study using the OpenSAFELY platform

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## **Summary**

**Background** COVID-19 has disproportionately affected minority ethnic populations in the UK. Our aim was to quantify ethnic differences in SARS-CoV-2 infection and COVID-19 outcomes during the first and second waves of the COVID-19 pandemic in England.

Methods We conducted an observational cohort study of adults (aged  $\geq$ 18 years) registered with primary care practices in England for whom electronic health records were available through the OpenSAFELY platform, and who had at least 1 year of continuous registration at the start of each study period (Feb 1 to Aug 3, 2020 [wave 1], and Sept 1 to Dec 31, 2020 [wave 2]). Individual-level primary care data were linked to data from other sources on the outcomes of interest: SARS-CoV-2 testing and positive test results and COVID-19-related hospital admissions, intensive care unit (ICU) admissions, and death. The exposure was self-reported ethnicity as captured on the primary care record, grouped into five high-level census categories (White, South Asian, Black, other, and mixed) and 16 subcategories across these five categories, as well as an unknown ethnicity category. We used multivariable Cox regression to examine ethnic differences in the outcomes of interest. Models were adjusted for age, sex, deprivation, clinical factors and comorbidities, and household size, with stratification by geographical region.

Findings Of 17 288 532 adults included in the study (excluding care home residents), 10 877 978 (62·9%) were White, 1025 319 (5·9%) were South Asian, 340 912 (2·0%) were Black, 170 484 (1·0%) were of mixed ethnicity, 320 788 (1·9%) were of other ethnicity, and 4553 051 (26·3%) were of unknown ethnicity. In wave 1, the likelihood of being tested for SARS-CoV-2 infection was slightly higher in the South Asian group (adjusted hazard ratio 1·08 [95% CI 1·07–1·09]), Black group (1·08 [1·06–1·09]), and mixed ethnicity group (1·04 [1·02–1·05]) and was decreased in the other ethnicity group (0·77 [0·76–0·78]) relative to the White group. The risk of testing positive for SARS-CoV-2 infection was higher in the South Asian group (1·99 [1·94–2·04]), Black group (1·69 [1·62–1·77]), mixed ethnicity group (1·49 [1·39–1·59]), and other ethnicity group (1·20 [1·14–1·28]). Compared with the White group, the four remaining high-level ethnic groups had an increased risk of COVID-19-related hospitalisation (South Asian group 1·48 [1·41–1·55], Black group 1·78 [1·67–1·90], mixed ethnicity group 1·63 [1·45–1·83], other ethnicity group 1·54 [1·41–1·69]), COVID-19-related ICU admission (2·18 [1·92–2·48], 3·12 [2·65–3·67], 2·96 [2·26–3·87], 3·18 [2·58–3·93]), and death (1·26 [1·15–1·37], 1·51 [1·31–1·71], 1·41 [1·11–1·81], 1·22 [1·00–1·48]). In wave 2, the risks of hospitalisation, ICU admission, and death relative to the White group were increased in the South Asian group but attenuated for the Black group compared with these risks in wave 1. Disaggregation into 16 ethnicity groups showed important heterogeneity within the five broader categories.

Interpretation Some minority ethnic populations in England have excess risks of testing positive for SARS-CoV-2 and of adverse COVID-19 outcomes compared with the White population, even after accounting for differences in sociodemographic, clinical, and household characteristics. Causes are likely to be multifactorial, and delineating the exact mechanisms is crucial. Tackling ethnic inequalities will require action across many fronts, including reducing structural inequalities, addressing barriers to equitable care, and improving uptake of testing and vaccination.

Funding Medical Research Council.

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#### Lancet 2021; 397: 1711-24

Published Online April 30, 2021 https://doi.org/10.1016/ S0140-6736(21)00634-6

This online publication has been corrected. The corrected version first appeared at thelancet.com on May 6, 2021

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#### Research in context

#### Evidence before this study

We searched PubMed for population-based studies examining the association between ethnicity and COVID-19. Keywords included (ethnic\* OR race) AND (COVID OR coronavirus OR SARS-CoV-2) AND (UK or England) AND (risk OR rate OR odds). Results were filtered to human studies published from 2019 onwards with abstracts available. We identified six studies examining ethnic differences in SARS-CoV-2 infection and COVID-19 outcomes in population-based samples. Five studies from the UK Biobank reported an increased risk of SARS-CoV-2 infection and COVID-19-related hospitalisation in Black and South Asian groups compared with White groups. As the UK Biobank cohort is known to be healthier, less deprived, and less ethnically diverse than the UK population, these findings are not wholly generalisable to the wider UK population. Our previous study using the OpenSAFELY platform showed an increased risk of COVID-19-related death in minority ethnic groups, but did not examine the role of household size or examine ethnic differences in SARS-CoV-2 infection and COVID-19 outcomes earlier in the care pathway.

#### Added value of this study

This is the largest study in the UK to examine ethnic inequalities in testing positive for SARS-CoV-2 and in COVID-19-related outcomes in a cohort covering 40% of the population in England. Additionally, it is the only population-representative study to date that accounts for household size in addition to sociodemographic characteristics and clinical comorbidities. By examining ethnicity according to both high-level and detailed ethnic groupings, we have shown important ethnic differences in the risk of testing positive for SARS-CoV-2 and the risks of COVID-19-related hospital admission, intensive care unit admissions, and death. We showed that multiple factors contribute to ethnic inequalities in COVID-19 and the importance of these factors varies by ethnic group. Compared with wave 1, the risks of COVID-19-related hospitalisation and death in wave 2 were increased for South Asian groups and reduced in all other ethnic minority groups relative to the White group.

#### Implications of all the available evidence

The risks of SARS-CoV-2 infection and severe COVID-19 outcomes are disproportionately increased in minority ethnic groups, both in the UK and internationally. Reducing ethnic inequalities in COVID-19 risks requires action on social determinants including addressing disadvantage and discrimination, reducing risk of infection and transmission, improving quality of and access to quality clinical care, and improving management of pre-existing clinical conditions. The appropriate balance of these actions needs tailoring for different ethnic groups.

## Introduction

The risks of SARS-CoV-2 infection and COVID-19 disease have been reported to be disproportionately increased in minority ethnic groups compared with White groups<sup>1-4</sup> in the UK and in other countries, including the USA<sup>5</sup> and Brazil.<sup>6</sup> It is hypothesised that these differences might be driven by factors such as living in deprived areas; working in high-exposure or front-line occupations; living in large, multigenerational households; a higher burden of underlying conditions; discrimination; and poor access to health or community services.<sup>7-10</sup>

For the **OpenSAFELY platform** see https://opensafely.org/

In the UK, the collection of ethnicity data is considered essential for identifying and reducing ethnic inequalities.<sup>11,12</sup> Although there is no single universally accepted definition of ethnicity, it serves as an important social construct and surrogate marker for shared exposures or risks for people with similar social, biological, and cultural characteristics.<sup>13-15</sup>

To date, many studies on COVID-19 have reported findings according to broad ethnic categories—such as White, South Asian, and Black—rather than considering disaggregated groupings. Furthermore, most evidence has been derived from populations with severe disease requiring hospitalisation, making it difficult to extrapolate findings to the general population.<sup>16–21</sup> Finally, although previous studies have accounted for health status, socioeconomic deprivation, or household composition, none yet have considered these factors in conjunction.<sup>22,23</sup>

The aim of this study was to estimate the effect of ethnicity on being tested and testing positive for SARS-CoV-2, and on COVID-19-related hospitalisation, intensive care unit (ICU) admission, and mortality, recognising the potential role of sociodemographic, clinical, and household-related factors.

## Methods

## Study design and population

We did a population-based, observational cohort study using the OpenSAFELY platform, for which National Health Service (NHS) England is the data controller. OpenSAFELY holds electronic health record data for 24 million people registered with primary care practices using TPP software, representing around 40% of the population of England.

Individual-level primary care data were linked to SARS-CoV-2 testing data from the Second Generation Surveillance System, COVID-19-related hospital admissions from the Secondary Uses Service, COVID-19-related ICU admissions from the Intensive Care National Audit & Research Centre,<sup>24</sup> and mortality data from the Office for National Statistics (ONS). The study population comprised adults aged 18 years and older who were registered with a primary care practice on Feb 1, 2020. The study periods were from Feb 1 to Aug 3, 2020 (for wave 1), and from Sept 1 to Dec 31, 2020 (for wave 2). A minimum of 12 months of continuous registration before the start date of each wave was required for inclusion, to ensure that baseline factors were adequately captured. Individuals residing in care homes were excluded from the main analyses because we hypothesised that the role of sociodemographic, clinical, and household characteristics would be systematically different for care home residents than for the general population.

This study was approved by the Health Research Authority (REC reference 20/LO/0651) and by the London School of Hygiene & Tropical Medicine's Ethics Board (reference 21863). Patient data were pseudonymised for analysis and linkage using industry standard cryptographic hashing techniques, and all pseudonymised datasets transmitted for linkage onto OpenSAFELY were encrypted. Only aggregate statistical outputs could leave the TPP platform environment, following best practice for anonymisation of results such as statistical disclosure control for low cell counts. The OpenSAFELY research platform adheres to the data protection principles of the UK Data Protection Act 2018 and the EU General Data Protection Regulation 2016.

## Exposures

The primary exposure was self-reported ethnicity as captured on the primary care record, collapsed into the five high-level and 16 detailed census categories of White (White British, White Irish, other White), South Asian (Indian, Pakistani, Bangladeshi, other South Asian), Black (African, Caribbean, other Black), other (Chinese, all others), and mixed (White and Asian, White and African, White and Caribbean, other mixed). An unknown ethnicity category was also included. Comparisons were reported for the five high-level ethnic groups with the White group as the reference category, and for the 16 disaggregated groups, with the White British group as the reference category.

## Outcomes

Outcomes of interest included receiving a PCR test for SARS-CoV-2, testing positive for SARS-CoV-2, and COVID-19-related hospital admission, ICU admission, and death (defined as the presence of ICD-10 codes U07.1 [confirmed COVID-19] or U07.2 [suspected COVID-19] anywhere on the death certificate). Testing outcomes were obtained from the UK's pillar 1 (NHS and Public Health England laboratories) and pillar 2 (commercial partners) testing strategies and included results from PCR swab tests used to identify symptomatic individuals.<sup>25,26</sup>

## Covariates

Demographic characteristics included age, sex, deprivation, household size, number of primary care consultations in the past 12 months, and geographical region (defined by the sustainability and transformation partnership [STP], an NHS administrative area). Deprivation was defined using quintiles of the Index of Multiple Deprivation, an area-level composite measure of seven domains: income, employment, education, skills and training, health and disability, crime, and barriers to housing services and living environment.<sup>27</sup> Household size (categorised as 1–2, 3–5, 6–10, or  $\geq$ 11 people) was determined using the number of individuals of all ages in OpenSAFELY residing at the same address on Feb 1, 2020.

Clinical covariates were identified using the Read clinical classification system<sup>28</sup> and included bodymass index (BMI), glycated haemoglobin (HbA<sub>1c</sub>), blood pressure, and smoking status. BMI in kg/m<sup>2</sup> was grouped into six categories using the WHO classification, with adjustments for South Asian ethnicity: underweight (<18.5 kg/m<sup>2</sup>), normal weight  $(18 \cdot 5 - 24 \cdot 9 \text{ kg/m}^2 \text{ [or } 18 \cdot 5 - 23 \cdot 5 \text{ kg/m}^2 \text{ if South Asian]}),$ overweight (25.0–29.9 kg/m<sup>2</sup> [23.6–27.5 kg/m<sup>2</sup>]); obese I (30.0-34.9 kg/m<sup>2</sup> [27.5-32.4 kg/m<sup>2</sup>]); obese II (35.0-39.9 kg/m<sup>2</sup> [32.5-37.4 kg/m<sup>2</sup>]); and obese III ( $\geq$ 40 kg/m<sup>2</sup> [ $\geq$ 37.5 kg/m<sup>2</sup>]). HbA<sub>1c</sub> was grouped into five categories (<6.5%, 6.5–7.4%, 7.5–7.9%, 8.0–8.9%, and  $\geq 9.0\%$ ). Blood pressure was grouped into four categories: normal (<120/<80); elevated (120 to 130/<80); high, stage I (131 to <140/80 to <90); and high, stage II (≥140/≥90). Smoking status was grouped into current, former, and never smokers. Those with missing smoking status were categorised as never smokers. Those with missing BMI, HbA<sub>1c</sub> or blood pressure data were grouped into a separate category of "unknown".

Clinical comorbidities were considered present at baseline if they were recorded at any time before Feb 1, 2020 (for wave 1) or Sept 1, 2020 (for wave 2). Comorbidities included the following: hypertension, asthma, chronic respiratory disease, chronic heart disease, type 1 and type 2 diabetes, cancer, chronic liver diseases, stroke, dementia, other chronic neurological diseases, chronic kidney disease (defined as an estimated glomerular filtration rate <60 mL/min per 1.73 m<sup>2</sup>), end-stage renal failure, common autoimmune diseases (rheumatoid arthritis, systemic lupus erythematosus, or psoriasis), and immunosuppression (HIV infection, sickle cell disease, organ transplant, or asplenia). All codelists are available for review and reuse.<sup>29</sup>

## Statistical analysis

Sociodemographic and clinical characteristics at baseline were summarised using descriptive statistics, stratified by ethnic group. Follow-up began on Feb 1, 2020, for wave 1 and on Sept 1, 2020, for wave 2, and ended at the earliest occurrence of the outcome of interest, death, deregistration from a primary care practice, or the censoring date for the dataset capturing the outcome of interest (from July 30 to Aug 3, 2020, [for wave 1] or to Dec 31, 2020 [for wave 2]).

Multivariable Cox proportional hazards regression was used to estimate ethnic differences in the cause-specific hazard of each outcome in the whole denominator



Figure 1: Study population flowchart

See Online for appendix

population.30 All analyses were adjusted for age (using restricted cubic splines), sex, deprivation quintile, diagnosed comorbidities, BMI, HbA<sub>te</sub>, blood pressure, number of primary care consultations in the preceding 12 months, and household size. To investigate the extent to which age-sex-adjusted ethnicity-associated differences could further be explained by deprivation, comorbidities, and household size, we sequentially adjusted for age and sex in the first model, adding deprivation in the second model, comorbidities, clinical factors, and primary care consultations in the third model, and household size in the fourth model. All models were stratified by STP to account for clustering by geographical region. All analyses were done separately for wave 1 and wave 2. Analyses of COVID-19-related hospital admissions for wave 1 were added during the revision stage of this Article as data on hospitalisations became available in OpenSAFELY after the initial submission; therefore, cohort sizes slightly differ for this outcome compared with other outcomes.

In secondary analyses, we estimated ethnic differences in the risk of non-COVID-19 death (defined as any death without a COVID-19 diagnosis code anywhere on the death certificate). Additionally, we used logistic regression adjusting for all covariates to examine ethnic differences in the odds of testing positive among those tested for SARS-CoV-2. We also estimated differences between ethnic groups in all outcomes for care home residents, adjusting for all covariates except for household size. In sensitivity analyses, we used multiple imputation to account for missing ethnicity data, examining differences between ethnic groups in the risk of death where COVID-19 was the underlying cause (rather than any cause) and exploring the effect of regional variation on ethnic differences in all outcomes. Proportional hazards assumptions were assessed by testing for a zero slope in the scaled Schoenfeld residuals and graphical inspection of Kaplan-Meier plots.

Data management was done with Python 3.8 and SQL, and analysis was done using Stata 16.

### Role of the funding source

The funders of the study had no role in study design, data collection, data analysis, data interpretation, or writing of the report.

## Results

From a total of 23 600 617 individuals in the OpenSAFELY database on Feb 1, 2020, 17 288 532 adults aged 18 years or older who met the selection criteria were included in the study (figure 1). The ethnic breakdown of the study population was 10877 978 (62.9%) people of White ethnicity, 1025 319 (5.9%) of South Asian ethnicity, 340 912 (2.0%) of Black ethnicity, 320788 (1.9%) of other ethnicity, 170 484 (1.0%) of mixed ethnicity, and 4553 051 (26.3%) of unknown ethnicity. Compared with the White population, minority ethnic groups were younger and over-represented in deprived neighbourhoods, large households, and diabetic populations (table 1; appendix p 3).

Between Feb 1 and Aug 3, 2020 (wave 1), 1216 801 (7.0%) people in the study population received a test for SARS-CoV-2 infection, and 71246 (0.4%) tested positive (table 2). The ethnic breakdown of individuals who received a test was similar to that of the general population, although test recipients were slightly older with more comorbid chronic conditions than the general population (appendix p 4). After accounting for all measured explanatory variables (age, sex, deprivation, comorbidities, clinical factors, primary care consultations in the preceding 12 months, and household size, with stratification by STP region), South Asian, Black, and mixed ethnicity groups were more likely to be tested (South Asian group adjusted hazard ratio [HR] 1.08 [95% CI 1.07–1.09], Black group 1.08 [1.06–1.09], mixed ethnicity group 1.04 [1.02-1.05]) and to test positive for SARS-CoV-2 (1.99 [1.94-2.04], 1.69 [1.62-1.77], 1.49 [1.39-1.59] compared with the White ethnic group (figure 2). Across the 16 subcategories of ethnicity, risks of testing positive were similar to those of the respective high-level categories, except for the Chinese group, for whom risks of being tested and testing positive (0.49 [0.42-0.58]) were lower than for the White British group. When restricted to the population who had ever received a test (as opposed to the whole denominator population used in the primary analysis), patterns by

ethnic group remained unchanged, except for the Chinese group, who had an equivalent risk of testing positive (odds ratio [OR] 1.13 [95% CI 0.95-1.34], adjusted for all explanatory variables; appendix p 15).

Between Feb 1 and Aug 3, 2020, 32473 (0.2%) individuals in the study population were admitted to hospital for COVID-19, 3096 (<0.1%) were admitted to ICU for COVID-19, and there were 11649 (0.1%) COVID-19-related deaths (table 2). After accounting for all measured explanatory factors, risk of hospitalisation was increased, relative to the White reference groups, in all minority ethnic groups (South Asian group adjusted HR 1.48 [95% CI 1.41-1.55], Black group 1.78 [1.67-1.90], mixed ethnicity group 1.63 [1.45-1.83], other ethnicity group 1.54 [1.41-1.69]), including all minority ethnic subcategories except the Chinese group (0.97 [0.77-1.23]; figure 3A). Risk of ICU admission was around 2-3 times in the four broad minority ethnic groups (South Asian group 2.18 [1.92–2.48], Black group  $3 \cdot 12 [2 \cdot 65 - 3 \cdot 67]$ , mixed ethnicity group  $2 \cdot 96 [2 \cdot 26 - 3 \cdot 87]$ , other ethnicity group 3.18 [2.58-3.93]) relative to the White reference group, and around 2-5 times higher among South Asian, Black, mixed, and other ethnic subcategories relative to the White British group (figure 3B). Risk of COVID-19-related death was increased by 22-51% in the four broad minority ethnic groups relative to the White group (South Asian group 1.26 [1.15-1.37], Black group 1.51 [1.31-1.71], mixed ethnicity group 1.41 [1.11-1.81], other ethnicity group 1.22 [1.00–1.48]; figure 4).

After accounting for age and sex, further adjustment had little effect on the likelihood of being tested for COVID-19. In South Asian groups, adjustment for clinical characteristics led to the largest reduction in HRs for testing positive for SARS-CoV-2 and hospitalisation and ICU admission due to COVID-19, and adjustment for deprivation and household size made equivalent reductions in HRs for COVID-19-related mortality. In all other minority ethnic groups, adjustment for social deprivation led to the largest reduction in HRs for all outcomes after accounting for age and sex (table 2; appendix p 5).

Between Sept 1 and Dec 31, 2020 (wave 2), 2647756 (15.3%) individuals in the study population received a test for SARS-CoV-2, 506773 (2.9%) tested positive, 18885 (0.1%) were admitted to hospital for COVID-19, 3351 (<0.1%) had a COVID-19 related ICU admission, and there were 7366 (<0.1%) COVID-19-related deaths. In contrast to wave 1, all four of the broad minority ethnic groups were less likely to be tested than the White group, and this pattern was also seen in all minority ethnic subcategories relative to the White British subcategory, with the exception of the Pakistani group (figure 2). The South Asian group (and each of its subgroups) remained at higher risk of testing positive (adjusted HR 1.32 [95% CI 1.31-1.33]) than the White group, and the risks of COVID-19-related hospitalisation (1.89 [1.79-2.00]), ICU admission (2.68 [2.39-3.01]), and death (1.87 [1.68-2.07]) were relatively greater in magnitude in wave 2 than in wave 1 (figures 2-4). In contrast to wave 1, the Black group (and all Black subgroups) was less likely than the White group to test positive (0.85 [0.84-0.87]; figure 2), although the risk of testing positive remained higher among those ever tested (OR 1.03 [95% CI 1.02-1.06] adjusted for all

	Overall (n=17 288 532)	White (n=10 877 978)	South Asian (n=1025319)	Black (n=340 912)	Mixed (n=170 484)	Other (n=320788)	Unknown (n=4 553 051)
Age, years	49.6 (18.6)	51·2 (18·2)	43.0 (15.4)	43·8 (15·5)	40.0 (14.9)	40.2 (15.0)	48.8 (20.0)
Sex							
Female	8638780 (50.0%)	5 650 496 (51·9%)	490 641 (47.9%)	169832 (49.8%)	87 678 (51.4%)	157 832 (49·2%)	2 082 301 (45.7%)
Male	8649752 (50.0%)	5227482 (48.1%)	534678 (52.1%)	171080 (50.2%)	82806 (48.6%)	162 956 (50·8%)	2 470 750 (54·3%)
Index of Multiple Deprivation							
1 (most affluent)	3495006 (20.2%)	2 294 962 (21.1%)	87798 (8.6%)	22716 (6.7%)	22259 (13·1%)	43209 (13·5%)	1024062 (22·5%)
2	3481686 (20.1%)	2 292 018 (21.1%)	114 552 (11·2%)	34 646 (10·2%)	27255 (16.0%)	54638 (17.0%)	958577 (21·1%)
3	3487259 (20.2%)	2 220 520 (20.4%)	189 485 (18·5%)	54731 (16·1%)	32256 (18.9%)	60843 (19.0%)	929424 (20.4%)
4	3 482 514 (20.1%)	2113382 (19·4%)	295273 (28.8%)	90 963 (26.7%)	40543 (23.8%)	79661 (24·8%)	862692 (18.9%)
5 (most deprived)	3342067(19.3%)	1957096 (18.0%)	338211(33.0%)	137 856 (40.4%)	48 171 (28·3%)	82 437 (25.7%)	778 296 (17·1%)
Number of people in household							
1–2	7533408 (43.6%)	5169700 (47·5%)	209599 (20.4%)	118164 (34.7%)	62 417 (36.6%)	118594 (37.0%)	1 854 934 (40.7%)
3–5	6166295 (35.7%)	3762179 (34.6%)	430 932 (42.0%)	135 543 (39.8%)	69564 (40.8%)	117 587 (36.7%)	1650490 (36-3%)
6-10	992375 (5·7%)	443780 (4·1%)	221312 (21.6%)	50 678 (14·9%)	18183 (10.7%)	39841 (12.4%)	218581 (4.8%)
≥11	169045 (1·0%)	75 056 (0.7%)	41 039 (4·0%)	6486 (1.9%)	3475 (2.0%)	14228 (4.4%)	28761 (0.6%)
Unknown	2 427 409 (14.0%)	1427263(13.1%)	122 437 (11·9%)	30041 (8.8%)	16 845 (9·9%)	30538 (9.5%)	800285 (17.6%)
Number of general practitioner consultations in the 12 months before baseline	3·0 (0·0-8·0)	4.0 (1.0–8.0)	3.0 (0.0–8.0)	3.0 (0.0–7.0)	2·0 (0·0–7·0)	1.0 (0.0–5.0)	2.0 (0.0–7.0)

	Overall (n=17288532)	White (n=10 877 978)	South Asian (n=1025319)	Black (n=340 912)	Mixed (n=170 484)	Other (n=320788)	Unknown (n=4553051)
(Continued from previous page)							
Smoking status							
Never*	8 653 213 (50·1%)	4882899 (44·9%)	751034 (73·2%)	232984 (68.3%)	96 363 (56·5%)	208 450 (65.0%)	2 481 483 (54·5%)
Former	5 683 564 (32·9%)	4 037 473 (37·1%)	159 103 (15·5%)	63290 (18.6%)	39798 (23.3%)	58768 (18·3%)	1325132 (29·1%)
Current	2 951 755 (17·1%)	1957606 (18·0%)	115182 (11·2%)	44 638 (13·1%)	34323 (20.1%)	53 570 (16.7%)	746 436 (16·4%)
BMI, kg/m²	27.4 (5.7)	27.5 (5.7)	26.6 (5.1)	28.0 (5.7)	26.8 (5.7)	25.2 (5.1)	27.7 (5.9)
BMI category, with adjustment for South	Asian populations						
Underweight	294735 (1·7%)	180 046 (1·7%)	26124 (2.5%)	5012 (1·5%)	3800 (2.2%)	11844 (3.7%)	67909 (1·5%)
Normal	4571011 (26·4%)	3234076 (29.7%)	176 170 (17.2%)	81236 (23.8%)	53668 (31.5%)	120 216 (37·5%)	905645(19.9%)
Overweight	4666217 (27·0%)	3218869 (29.6%)	313 478 (30.6%)	97 270 (28·5%)	42 901 (25·2%)	71463 (22·3%)	922236 (20.3%)
Obese I	2 457 922 (14·2%)	1633030(15.0%)	212 808 (20.8%)	54909 (16·1%)	20662 (12.1%)	27 228 (8·5%)	509 285 (11·2%)
Obese II	949367 (5·5%)	631273 (5.8%)	71 428 (7.0%)	21383 (6.3%)	7825 (4.6%)	8355 (2.6%)	209 103 (4.6%)
Obese III	474 090 (2·7%)	318 199 (2·9%)	28812 (2.8%)	10282 (3.0%)	4076 (2.4%)	3505 (1·1%)	109216 (2.4%)
Unknown	3875190 (22·4%)	1662485 (15.3%)	196 499 (19·2%)	70820(20.8%)	37 552 (22.0%)	78 177 (24·4%)	1829657 (40.2%)
HbA <sub>1c</sub> %	5.9 (1.0)	5.8 (1.0)	6.1 (1.2)	6.0 (1.2)	5.9 (1.1)	5.8 (1.0)	5.9 (1.0)
HbA <sub>10</sub> , mmol/mol	41.0 (92.7)	40.4 (62.2)	44.3 (218.2)	42.8 (138.9)	40.5 (12.0)	40.2 (10.7)	41.4 (101.9)
HbA <sub>1c</sub> category							
<6.5%	6706373(38.8%)	4546662(41.8%)	424221 (41.4%)	127134 (37.3%)	54728 (32.1%)	92552 (28·9%)	1461076 (32.1%)
6.5-7.4%	582 059 (3.4%)	350 237 (3.2%)	64385 (6.3%)	15294 (4·5%)	4500 (2.6%)	7680 (2.4%)	139 963 (3.1%)
7.5-7.9%	155 580 (0.9%)	94158 (0.9%)	17117 (1.7%)	3376 (1.0%)	1144 (0.7%)	1825 (0.6%)	37960 (0.8%)
8.0-8.9%	168 963 (1.0%)	103062 (0.9%)	18312(1.8%)	3558 (1.0%)	1226 (0.7%)	1965 (0.6%)	40840 (0.9%)
≥9.0%	190 305 (1.1%)	115 910 (1.1%)	21060 (2.1%)	5415 (1.6%)	1686 (1.0%)	2215 (0.7%)	44 019 (1.0%)
Unknown	9485252(54.9%)	5667949 (52.1%)	480224 (46.8%)	186 135 (54-6%)	107200 (62.9%)	214 551 (66.9%)	2829193(62.1%)
Blood pressure (mm Hg)	,	,				,	,
Systolic	128.0 (15.7)	128.3 (15.5)	123.8 (15.4)	127.1 (16.0)	124.0 (15.3)	122.5 (15.4)	129.0 (15.9)
Diastolic	76.8 (9.9)	76.8 (9.8)	76.5 (9.7)	78.0 (10.3)	76.6 (10.1)	75.8 (10.0)	76.7 (10.0)
Blood pressure category	. ( /						
Normal	2653823(15.4%)	1719408(15.8%)	211095 (20.6%)	56786 (16.7%)	32711 (19.2%)	57 475 (17.9%)	576 348 (12.7%)
Elevated	1818544(10.5%)	1225760 (11.3%)	99291 (9.7%)	32093 (9.4%)	15713 (9.2%)	23598 (7.4%)	422 089 (9.3%)
High, stage I	4270604(24.7%)	2880135 (26.5%)	238 962 (23.3%)	80 605 (23.6%)	35154 (20.6%)	53458 (16.7%)	982290 (21.6%)
High, stage II	3010178(17.4%)	2025395(18.6%)	120 401 (11.7%)	54017 (15.8%)	19008 (11.1%)	26 433 (8.2%)	764 924 (16.8%)
Unknown	5 535 383 (32.0%)	3027280(27.8%)	355 570 (34.7%)	117 411 (34.4%)	67898 (39.8%)	159824(49.8%)	1807400(39.7%)
Comorbidities	,	_ , ,	,	,	,	,	(
Type 1 diabetes	88294(0.5%)	59940 (0.6%)	2508 (0.2%)	1363 (0.4%)	637 (0·4%)	637 (0.2%)	23209 (0.5%)
Type 2 diabetes	1234858(7.1%)	747 798 (6.9%)	135741 (13.2%)	31590 (9.3%)	9603 (5.6%)	15 527 (4.8%)	294 599 (6.5%)
Diagnosed hypertension	3703816(21.4%)	2 437 571 (22.4%)	173237 (16.9%)	69524 (20.4%)	20712 (12.1%)	31706 (9.9%)	971066 (21.3%)
Chronic heart disease	1193155 (6.9%)	803 572 (7.4%)	53 903 (5.3%)	11092 (3.3%)	4731 (2.8%)	8136 (2.5%)	311721 (6.8%)
Stroke	368707 (2.1%)	249 742 (2.3%)	12,429 (1.2%)	4373 (1.3%)	1495 (0.9%)	2161 (0.7%)	98507(2.2%)
Chronic kidney disease†	978 300 (5.7%)	647.085 (5·9%)	27 979 (2.7%)	15042 (4.4%)	3787 (2.2%)	4782 (1.5%)	279 625 (6.1%)
End-stage renal failure	25348 (0.1%)	14615 (0.1%)	2410 (0.2%)	878 (0.3%)	219 (0.1%)	352 (0.1%)	6874 (0.2%)
Cancer	979 433 (5.7%)	684824(6.3%)	19868 (1.9%)	9249 (2.7%)	3718 (2.2%)	6640 (2.1%)	255134(5.6%)
Autoimmune disease	889832(5.1%)	615132 (5.7%)	37348 (3.6%)	6912 (2.0%)	4988 (7.9%)	7504 (2.3%)	217948 (4.8%)
Immunosuppression	93162 (0.5%)	54143 (0.5%)	4602 (0.4%)	10.087 (3.0%)	2118 (1.2%)	1425 (0.4%)	20787 (0.5%)
Chronic liver disease	104781 (0.6%)	69 901 (0.6%)	5677 (0.6%)	3035 (0.9%)	894 (0.5%)	2445 (0.8%)	22 829 (0.5%)
Dementia	34169 (0.2%)	22 855 (0.2%)	1199 (0.1%)	538 (0.2%)	106 (0.1%)	195 (0.1%)	9276 (0.2%)
Neurological disease	169/82 (1.0%)	116 200 (1.1%)	5803 (0.6%)	1951 (0.6%)	888 (0.5%)	1162 (0.4%)	12,3 (0·2/0)
Acthma	2663321 (15.4%)	1700 075 (16.5%)	1257/5 (12.2%)	37351 (0.0%)	25776 (15.1%)	22 /06 (7.0%)	661068 (14.5%)
Chronic respiratory dispaso	718 0/7 (1.2%)	5776E (1.80/)	17 / 2E (1.70/)	5002 (1 E0/)	23770 (1304)	2520 (1.1%)	162 550 (14.3%)
chrome respiratory usedse	/ 10 04/ (4.2%)	J27 203 (4·070)	±/ +>> (±·/ 70)	2002 (1.2%)		(1.1%) ۲۰۲۵	102 330 (3.0%)
Data are mean (SD), n (%), or median (IQR). E	3MI=body-mass index. H	IbA <sub>1c</sub> =glycated haemog	lobin. *Including those	with missing data. †Defir	ned as estimated glome	erular filtration rate <60	) mL/min per 1.73 m².

Table 1: Baseline characteristics by ethnic group

	Denominator	Events	Hazard ratio (95% CI)						
			Crude	Age-sex adjusted	Plus deprivation	Plus comorbidities and clinical factors*	Plus household size		
Tested for SARS	G-CoV-2 (n=1216	801)							
White	10877978	793181 (7·3%)	1 (ref)	1 (ref)	1 (ref)	1 (ref)	1 (ref)		
South Asian	1025319	82 647 (8.1%)	1.08 (1.08–1.09)	1.11 (1.10–1.12)	1.09 (1.08–1.09)	1.09 (1.08–1.09)	1.08 (1.07–1.09)		
Black	340 912	25305 (7.4%)	1.04 (1.03–1.05)	1.08 (1.06–1.09)	1.04 (1.03–1.06)	1.08 (1.06–1.09)	1.08 (1.06–1.09)		
Mixed	170484	12 126 (7.1%)	1.00 (0.98–1.01)	1.03 (1.01–1.05)	1.01 (1.00–1.03)	1.04 (1.02–1.06)	1.04 (1.02–1.05)		
Other	320788	15824 (4.9%)	0.68 (0.67–0.69)	0.71 (0.69–0.72)	0.70 (0.69–0.71)	0.78 (0.77–0.79)	0.77 (0.76–0.78)		
Unknown	4553051	287718 (6.3%)	0.86 (0.86–0.87)	0.88 (0.88–0.89)	0.89 (0.88–0.89)	0.97 (0.97–0.98)	0.97 (0.97–0.98)		
Tested positive	for SARS-CoV-2 (	n=71246)							
White	10877978	41180 (0.4%)	1 (ref)	1 (ref)	1 (ref)	1 (ref)	1 (ref)		
South Asian	1025319	9679 (0.9%)	2.38 (2.32-2.43)	2.64 (2.57–2.70)	2.45 (2.39–2.51)	2.16 (2.10–2.21)	1.99 (1.94–2.04)		
Black	340 912	2286 (0.7%)	1.82 (1.74–1.90)	2.04 (1.95–2.13)	1.86 (1.78–1.94)	1.74 (1.67–1.82)	1.69 (1.62–1.77)		
Mixed	170 484	840 (0.5%)	1.37 (1.28–1.46)	1.59 (1.48–1.70)	1.52 (1.42–1.63)	1.51 (1.41–1.62)	1.49 (1.39–1.59)		
Other	320788	1213 (0.4%)	1.06 (1.00–1.12)	1.22 (1.15–1.29)	1.18 (1.11–1.25)	1.25 (1.18–1.33)	1.20 (1.14–1.28)		
Unknown	4553051	16048 (0.4%)	0.97 (0.95–0.99)	0.99 (0.98–1.01)	1.00 (0.98–1.02)	1.06 (1.04–1.08)	1.06 (1.04–1.08)		
COVID-19-relat	ed hospital admis	ssion† (n=32 473)							
White	11110312	20504 (0.2%)	1 (ref)	1 (ref)	1 (ref)	1 (ref)	1 (ref)		
South Asian	1026551	2836 (0.3%)	1.26 (1.21–1.31)	2.04 (1.96–2.13)	1.83 (1.76–1.91)	1.59 (1.52–1.66)	1.48 (1.41–1.55)		
Black	342 561	1051 (0.3%)	1.39 (1.30–1.48)	2.18 (2.05–2.33)	1.89 (1.77–2.01)	1.81 (1.70–1.94)	1.78 (1.67–1.90)		
Mixed	171 933	302 (0.2%)	0.86 (0.77–0.97)	1.78 (1.59–1.99)	1.64 (1.47–1.84)	1.65 (1.47–1.85)	1.63 (1.45–1.83)		
Other	323 529	504 (0·2%)	0.77 (0.71–0.85)	1.52 (1.39–1.66)	1.43 (1.31–1.57)	1.59 (1.45–1.74)	1.54 (1.41–1.69)		
Unknown	4 408 386	7276 (0·2%)	0.91 (0.88-0.93)	0.96 (0.94–0.99)	0.97 (0.94–0.99)	1.06 (1.03–1.09)	1.06 (1.03–1.09)		
COVID-19-relat	ed intensive care	unit admission (n=	3096)						
White‡	10877978	1700 (<0.1%)	1 (ref)	1 (ref)	1 (ref)	1 (ref)	1 (ref)		
South Asian	1025319	410 (<0.1%)	2.38 (2.12–2.67)	3·30 (2·93–3·71)	3.05 (2.71–3.44)	2·34 (2·07–2·64)	2.18 (1.92-2.48)		
Black	340 912	186 (0.1%)	3.08 (2.63–3.60)	3-91 (3-34-4-58)	3.52 (3.00-4.13)	3.21 (2.73–3.77)	3.12 (2.65-3.67)		
Mixed	170484	56 (<0.1%)	1.97 (1.51–2.57)	3.19 (2.44–4.17)	3.01 (2.30–3.94)	3.02 (2.31–3.95)	2.96 (2.26–3.87)		
Other	320788	97(<0.1%)	1.83 (1.48–2.25)	2.92 (2.37–3.60)	2.80 (2.27-3.45)	3.28 (2.66–4.06)	3.18 (2.58–3.93)		
Unknown	4553051	662 (<0.1%)	0.95 (0.87–1.04)	1.03 (0.94–1.12)	1.03 (0.94–1.13)	1.09 (0.99–1.19)	1.08 (0.99–1.19)		
COVID-19-relat	ed death (n=1164	49)							
White	10877978	7514 (0.1%)	1 (ref)	1 (ref)	1 (ref)	1 (ref)	1 (ref)		
South Asian	1025319	734 (0.1%)	0.89 (0.83–0.97)	1.85 (1.71–2.01)	1.64 (1.52–1.78)	1.47 (1.35–1.60)	1·26 (1·15–1·37)		
Black	340 912	268 (0.1%)	0.96 (0.85–1.09)	1.88 (1.66–2.13)	1.61 (1.42–1.82)	1.50 (1.32–1.70)	1.51 (1.33–1.71)		
Mixed	170 484	65 (<0.1%)	0.51 (0.40-0.65)	1.58 (1.23–2.01)	1.44 (1.13–1.84)	1.43 (1.12–1.83)	1.41 (1.11–1.81)		
Other	320788	107 (<0.1%)	0.44 (0.37–0.54)	1.25 (1.03–1.51)	1.17 (0.97–1.42)	1.24 (1.02–1.50)	1.22 (1.00–1.48)		
Unknown	4553051	2961 (0.1%)	0.95 (0.91–0.99)	0.92 (0.88–0.96)	0.93 (0.89–0.97)	1.00 (0.95–1.04)	1.01 (0.97–1.06)		

Data are N, n (%), or hazard ratio (95% CI). \*Including number of primary care consultations in the preceding 12 months.  $\pm$ Analyses of COVID-19-related hospital admissions for wave 1 were added during the revision stage of this Article as data on hospitalisations became available in OpenSAFELY after the initial submission; therefore, cohort sizes differ for this outcome compared with other outcomes.  $\pm$ For categories containing small numbers ( $\leq$ 5) within any subcategory, we have rounded all counts to the nearest 10, per data disclosure agreements.

Table 2: Associations between ethnicity in five categories and COVID-19 outcomes in wave 1, with serial adjustment

explanatory variables; appendix p 15), rather than the general denominator population. Risks of COVID-19-related hospitalisation (adjusted HR 1.23 [95% CI 1.11-1.37]) and ICU admission (1.67 [1.37-2.05]) remained higher for the Black group than for the White group in wave 2, but these risks were attenuated in magnitude compared with wave 1 (figure 3). However, in contrast to the pattern seen in the broader Black group, the risk of COVID-19-related hospitalisation in the Caribbean subgroup did not differ from that of the White British

group (0.98 [0.81-1.17]). Additionally, the excess risk of COVID-19 death was attenuated for the Black group in wave 2 compared with wave 1, so that no differences between the White and Black groups remained in wave 2 (0.92 [0.73-1.16]; figure 4).

71920 non-COVID-19-related deaths occurred in the study population during wave 1. The risk of non-COVID-19-related death was 15–32% lower in all non-White ethnic groups (South Asian group adjusted HR 0.85 [95% CI 0.81-0.90], Black group 0.85 [0.78-0.92], mixed ethnicity

A Tested for SARS-CoV-2											
		Wave 1						Wave 2			
	Denominator	Events			HR (95% CI)	Denominator	Events				HR (95% CI)
All White ethnicities*	10877978	793181 (7·3%)		•	1 (ref)	11323083	1733272 (15·3%)		ł		1 (ref)
White British*	9461409	713121 (7.5%)		+	1 (ref)	9845315	1567742 (15·9%)		ł		1 (ref)
White Irish	78170	6160 (7·9%)		•	1.06 (1.04–1.09)	81185	11 763 (14·5%)	•			0.94 (0.92-0.96)
Other White	1338399	73900 (5·5%)	•		0.80 (0.80-0.81)	1396583	153767 (11·0%)	•			0.67 (0.66-0.67)
All South Asian ethnicities	1025319	82647 (8·1%)		•	1.08 (1.07–1.09)	1061336	166 <b>856 (15</b> ·7%)	•	1		0-96 (0-95-0-96)
Indian	431814	40231 (9·3%)		•	1.15 (1.14–1.16)	447812	66 056 (14·8%)	•			0.88 (0.87-0.88)
Pakistani	301496	21952 (7·3%)		•	0.94 (0.93-0.96)	309214	58882 (19.0%)		•		1.02 (1.02–1.03)
Bangladeshi	69959	3924 (5.6%)	•		0.70 (0.67-0.72)	73154	11396 (15.6%)	•			0.81 (0.79-0.82)
Other South Asian	222 050	16540 (7.4%)		•	1.06 (1.04-1.07)	231156	30522 (13.2%)	•			0.77 (0.76-0.77)
All Black ethnicities	340912	25305 (7.4%)		•	1.08 (1.06-1.09)	355 625	48 068 (13.5%)	•			0.83 (0.82-0.84)
Caribbean	82561	5972 (7.2%)		•	0.97 (0.95-1.00)	84219	10749 (12.8%)	•			0.76 (0.75-0.78)
African	190164	14623 (7.7%)		•	1.09 (1.08-1.11)	199012	27417 (13.8%)	•			0.78 (0.77-0.79)
Other Black	68187	4710 (6.9%)		•	0.96 (0.94-0.99)	72394	9902 (13.7%)	•			0.77 (0.75-0.78)
All mixed ethnicities	170484	12126 (7.1%)		•	1.04 (1.02-1.05)	179 557	26679 (14.9%)	•			0.90 (0.88-0.91)
White and Caribbean	39208	2838 (7.2%)		•	0.96 (0.92-0.99)	41228	6868 (16.7%)	•			0.90 (0.88-0.92)
White and African	33194	2619 (7.9%)		•	1.15 (1.10–1.19)	34 9 9 1	5134 (14.7%)	•			0.83 (0.81–0.86)
White and Asian	34264	2608 (7.6%)			1.07 (1.03–1.12)	36257	5548 (15.3%)	•			0.87 (0.85-0.90)
Other mixed ethnicity	63.818	4061 (6.4%)			0.01 (0.80-0.04)	67.081	9129 (13.6%)	•			0.78 (0.76-0.80)
All other ethnicities	320788	15824 (4.9%)			0.77 (0.76-0.78)	334 962	32 904 (9.8%)	•			0.64 (0.64-0.65)
Chinese	103892	2800 (2.8%)			0.45 (0.43-0.46)	105658	6444 (6.1%)	•			0.38 (0.38-0.30)
All other ethnic groups	216.806	12.025 (6.0%)	•		0.87 (0.86-0.80)	220 204	26460 (11.5%)	•			0.60 (0.68-0.70)
Unknown ethnicity	4552051	287718 (6.2%)			0.07 (0.07-0.08)	4281802	620.077 (14.6%)	Ť	l		0.09 (0.00-0.70)
onknown cunnerty	400001	20//10(0 5/0)		1		4301003	033377 (±4 0%)		<u> </u>		<u> </u>
							·				·
B Tested positive for SAR	S-CoV-2										
All White ethnicities*	10877978	41180 (0·4%)		+	1 (ref)	11323083	307983 (2.7%)	•	ł		1 (ref)
White British*	9461409	36214 (0.4%)		•	1 (ref)	9845315	275080 (2.8%)	•	ł		1 (ref)
White Irish	78170	335 (0.4%)		-	1.15 (1.04–1.29)	81185	1772 (2·2%)	•			0.85 (0.81–0.89)
Other White	1338399	4631 (0.3%)		•	1.12 (1.08–1.16)	1396583	31131 (2.2%)	•			0.78 (0.77-0.79)
All South Asian ethnicities	1025319	9679 (0·9%)		*	1.99 (1.94-2.04)	1061336	50858 (4·8%)		•		1·32 (1·31–1·33)
Indian	431814	4035 (0·9%)		+	2.08 (2.00-2.15)	447812	18670 (4.2%)		+		1.18 (1.16–1.20)
Pakistani	301496	3466 (1.1%)		+	2.07 (1.99-2.15)	309214	19779 (6.4%)		•		1.46 (1.44–1.48)
Bangladeshi	69959	366 (0.5%)		+	1.10 (0.99–1.22)	73154	3935 (5.4%)		•		1.34 (1.29–1.38)
Other South Asian	222 050	1812 (0.8%)		+	2.24 (2.13-2.35)	231156	8474 (3.7%)		•		1.07 (1.05–1.10)
All Black ethnicities	340912	2286 (0.7%)		+	1.69 (1.62–1.77)	355 625	10218 (2.9%)	•			0.85 (0.84-0.87)
Caribbean	82561	530 (0.6%)		-	1.53 (1.40-1.67)	84219	2146 (2.5%)	•			0.81 (0.78-0.85)
African	190164	1390 (0.7%)		+	1.91 (1.80-2.02)	199012	5920 (3.0%)	•			0.81 (0.79-0.83)
Other Black	68187	366 (0.5%)		-	1.48 (1.33-1.64)	72394	2152 (3.0%)	•			0.84 (0.80-0.88)
All mixed ethnicities	170484	840 (0.5%)		+	1.49 (1.39-1.59)	179557	5583 (3.1%)		ł		0.98 (0.95-1.01)
White and Caribbean	39208	171 (0.4%)		<b>_</b>	1.24 (1.07–1.45)	41228	1414 (3.4%)		ł		0.99 (0.94–1.04)
White and African	33194	223 (0.7%)		_ <b></b>	1.92 (1.69–2.20)	34991	1110 (3.2%)	+			0.92 (0.87-0.98)
White and Asian	34264	192 (0.6%)		_ <b>—</b>	1.77 (1.53–2.04)	36257	1213 (3.3%)	-			1.02 (0.96–1.08)
Other mixed ethnicity	63818	254 (0.4%)			1.32 (1.17–1.49)	67081	1846 (2.8%)	-	ł		0.87 (0.83-0.91)
All other ethnicities	320788	1213 (0.4%)		+	1.20 (1.14-1.28)	334.962	6995 (2.1%)	•	1		0.72 (0.70-0.72)
Chinese	103.807	140 (0.1%)	+		0.49 (0.42-0.58)	105658	781 (0.7%)	•	1		0.26 (0.24-0.27)
All other ethnic groups	216 206	1072 (0.5%)		+	1.52 (1.44-1.62)	220204	6214 (2.7%)		1		0.86 (0.84-0.88)
Unknown ethnicity	1553UE1	16048 (0.4%)		•	1.06 (1.04-1.02)	4381 802	125126(2.0%)	•	•		1.04 (1.02-1.05)
Shahown cullicity	10001	10040(0.4%)		ļ	1.00 (1.04-1.00)	4301005			<u> </u>		T 04 (T-02-T-02)
			ò	1 2	3		0	1	1 .	2	3

Figure 2: Ethnic differences in the risks of being tested for SARS-CoV-2 infection (A) and testing positive for SARS-CoV-2 infection (B)

Models adjust for age, sex, deprivation quintile, all prespecified clinical comorbidities, body-mass index category, glycated haemoglobin category, systolic and diastolic blood pressure category, number of primary care consultations in the previous 12 months, household size, and stratification by sustainability and transformation partnership region. HR=hazard ratio. \*All White ethnicities is the reference category for comparison of ethnicity in the five broad categories, and White British is the reference category for comparison of ethnicity in the 16 subcategories.

group 0.81 [0.70–0.93]; other ethnicity group 0.68 [0.61–0.77]) than in the White group after adjustment for all measured explanatory variables (appendix p 5). In

wave 2, the risk of non-COVID-19-related death remained lower for the South Asian, Black, and other ethnicity groups than for the White group (appendix p 10).

A Admitted to hospital for	or COVID-19								
		Wave 1						Wave 2	
	Denominator	Events			HR (95% CI)	Denominator	Events		HR (95% CI)
All White ethnicities*	11110312	20504 (0.2%)			1 (ref)	11323083	12120 (0.1%)	Ļ	1 (ref)
White British*	9683276	18627 (0.2%)		1	1 (ref)	9845315	11209 (0.1%)		1 (ref)
White Irish	79945	257 (0.3%)		Ť.	1.14 (1.00–1.29)	81185	92 (0·1%)	-	0.94 (0.77-1.16)
Other White	1347091	1620 (0.1%)			1.04 (0.99–1.10)	1396583	819 (0.1%)	+	1.01 (0.94–1.09)
All South Asian ethnicities	1026551	2836 (0.3%)			1.48 (1.41–1.55)	1061336	2100 (0·2%)	+	1.89 (1.79–2.00)
Indian	432760	1179 (0.3%)		-	1.41 (1.32–1.50)	447812	665 (0.1%)	-	1.57 (1.44–1.71)
Pakistani	300528	924 (0.3%)			1.48 (1.38-1.59)	309214	992 (0·3%)	-	2.13 (1.98–2.30)
Bangladeshi	70395	153 (0.2%)			1.21 (1.03-1.42)	73154	151 (0.2%)		2.31 (1.96–2.72)
Other South Asian	222868	580 (0.3%)			1.85 (1.70-2.02)	231156	292 (0·1%)	_ <b>—</b>	1.94 (1.72–2.19)
All Black ethnicities	342561	1051 (0·3%)		-	1.78 (1.67–1.90)	355625	362 (0.1%)	+	1.23 (1.11-1.37)
Caribbean	83042	393 (0.5%)		-	1.58 (1.43-1.75)	84219	117 (0.1%)	-	0.98 (0.81–1.17)
African	190395	499 (0.3%)			2.10 (1.91-2.30)	199012	177 (0.1%)	-	1.44 (1.24–1.68)
Other Black	69124	159 (0.2%)		_ <b>_</b>	1.63 (1.39–1.90)	72394	68 (0.1%)	_ <b>_</b>	1.34 (1.05–1.70)
All mixed ethnicities	171933	302 (0.2%)			1.63 (1.45-1.83)	179 557	132 (0.1%)		1.33 (1.12-1.58)
White and Caribbean	39631	79 (0.2%)		<b>_</b>	1.43 (1.14–1.78)	41228	39 (0.1%)	<b></b>	1.27 (0.92-1.74)
White and African	33438	65 (0.2%)		<b>_</b>	1.86 (1.46-2.38)	34991	21 (0.1%)		1.10 (0.72-1.69)
White and Asian	34629	63 (0.2%)			1.98 (1.55-2.54)	36257	34 (0.1%)		1.88 (1.34-2.64)
Other mixed ethnicity	64235	95 (0.1%)			1.55 (1.27-1.90)	67081	38 (0.1%)	<b></b>	1.23 (0.89-1.69)
All other ethnicities	323529	504 (0.2%)		-	1.54 (1.41-1.69)	334962	222 (0.1%)	-	1.32 (1.16-1.51)
Chinese	104560	70 (0.1%)		-	0.97 (0.77-1.23)	105658	20 (<0.1%)	<b>—</b>	0.53 (0.34-0.82)
All other ethnic groups	218969	434 (0.2%)		-	1.74 (1.58-1.91)	229304	202 (0.1%)		1.56 (1.35-1.79)
Unknown ethnicity	4408386	7276 (0.2%)		*	1.06 (1.03-1.09)	4381803	3919 (0.1%)	•	1.07 (1.03-1.11)
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B Admitted to ICU for CO	VID-19							1	
All White ethnicities*†	10877978	1700 (<0.1%)		•	1 (ref)	11323083	1969 (<0·1%)		1 (ref)
White British*	9461409	1500 (<0.1%)		•	1 (ref)	9845315	1767 (<0.1%)	•	1 (ref)
White Irish	78170	10 (<0.1%)	-		0.38 (0.16-0.91)	81185	11 (<0.1%)		0.75 (0.42–1.36)
Other White	1338399	190 (<0.1%)		<b>~</b>	1.43 (1.23–1.68)	1396583	191 (<0.1%)	+	1.36 (1.17–1.59)
All South Asian ethnicities	1025319	410 (<0·1%)		-	2.18 (1.92-2.48)	1061336	534 (0·1%)		2.68 (2.39-3.01)
Indian	431814	161 (<0.1%)		<b>_</b>	2.10 (1.76–2.52)	447812	169 (<0.1%)		2.16 (1.82–2.58)
Pakistani	301496	118 (<0.1%)			2.03 (1.65–2.49)	309214	211 (0.1%)	_ <b>—</b>	3·10 (2·64–3·65)
Bangladeshi	69959	25 (<0.1%)			2.27 (1.52–3.41)	73154	47 (0·1%)		↓ 4·00 (2·96–5·40)
Other South Asian	222050	106 (<0.1%)			3.19 (2.59–3.94)	231156	107 (<0.1%)		3.19 (2.59–3.92)
All Black ethnicities	340 912	186 (0.1%)		<b>—</b> •—	3.12 (2.65-3.67)	355625	106 (<0.1%)		1.67 (1.37–2.05)
Caribbean	82561	41 (<0.1%)			2.30 (1.68–3.16)	84219	33 (<0.1%)	_ <b></b>	1.68 (1.18–2.39)
African	190164	118 (0.1%)			→ 4·20 (3·44–5·12)	199012	51 (<0.1%)		1.72 (1.29–2.29)
Other Black	68187	27 (<0.1%)			2.55 (1.74–3.75)	72394	22 (<0.1%)		1.90 (1.24–2.90)
All mixed ethnicities	170484	56 (<0·1%)			2.96 (2.26-3.87)	179 557	44 (<0·1%)	<b>_</b>	2·23 (1·65-3·02)
White and Caribbean	39208	11 (<0.1%)			2.32 (1.28-4.21)	41228	10 (<0.1%)		1.94 (1.04–3.62)
White and African	33194	21 (0.1%)			<b>→</b> 4·93 (3·19–7·60)	34991	11 (<0.1%)		2.44 (1.35-4.43)
White and Asian	34264	10 (<0.1%)		+	→3.31 (1.77-6.17)	36257	13 (<0.1%)		↓ 4·11 (2·38–7·10)
Other mixed ethnicity	63818	14 (<0.1%)			2.34 (1.38–3.97)	67081	10 (<0.1%)	+	1.63 (0.87-3.04)
All other ethnicities	320788	97 (<0·1%)			3.18 (2.58-3.93)	334962	60 (<0.1%)	_ <b>→</b>	1.90 (1.46–2.46)
Chinese	103892	18 (<0.1%)			→3·21 (2·01-5·12)	105658	8 (<0.1%)	+	1.45 (0.72–2.92)
All other ethnic groups	216896	79 (<0.1%)			3.41 (2.70-4.31)	229304	52 (<0.1%)	<b>→</b>	2.08 (1.57-2.76)
Unknown ethnicity	4553051	662 (<0·1%)		*	1.08 (0.99–1.19)	4381803	638 (<0·1%)	+	1.01 (0.92–1.11)

### Figure 3: Ethnic differences in the risk of COVID-19-related hospital admission (A) and COVID-19-related ICU admission (B)

Models adjust for age, sex, deprivation quintile, all prespecified clinical comorbidities, body-mass index category, glycated haemoglobin category, systolic and diastolic blood pressure category, number of primary care consultations in the previous 12 months, household size, and stratification by sustainability and transformation partnership region. Analyses of COVID-19-related hospital admissions for wave 1 were added during the revision stage of this Article as data on hospitalisations became available in OpenSAFELY after the initial submission; therefore, cohort sizes differ for this outcome compared with other outcomes. HR=hazard ratio. ICU=intensive care unit. \*All White ethnicities is the reference category for comparison of ethnicity in the five broad categories, and White British is the reference category for comparison of ethnicity in the 16 subcategories.  $\uparrow$ For categories containing small numbers ( $\leq$ 5) within any subcategory, we have rounded all counts to the nearest 10, per dat disclosure agreements.

		marci					wave 2		
	Denominator	Events		HR (95% CI)	Denominator	Events			HR (95% CI)
All White ethnicities*	10877978	7514 (0·1%)	+	1 (ref)	11323083	4874 (<0·1%)	+		1 (ref)
Nhite British*	9461409	6992 (0.1%)	+	1 (ref)	9845315	4599 (<0·1%)	ł		1 (ref)
Nhite Irish	78170	86 (0.1%)	-	0.92 (0.74–1.14)	81185	32 (<0.1%)			0.69 (0.49-0.98)
Other White	1338399	436 (<0.1%)	+	0.91 (0.82–1.00)	1396583	243 (<0.1%)	-		0.96 (0.84–1.09)
All South Asian ethnicities	1025319	734 (0.1%)	+	1·26 (1·15–1·37)	1061336	532 (0.1%)			1.87 (1.68-2.07)
ndian	431814	335 (0.1%)		1.29 (1.14-1.45)	447812	205 (<0.1%)		<b></b>	1.84 (1.58–2.15)
Pakistani	301496	210 (0.1%)	+	1.03 (0.89–1.19)	309214	240 (0.1%)			1.94 (1.67–2.24)
3angladeshi	69959	49 (0.1%)	<b></b>	1.29 (0.97-1.71)	73154	39 (0.1%)			→ 2.26 (1.64-3.13)
Other South Asian	222050	140 (0.1%)		1.57 (1.32–1.87)	231156	48 (<0.1%)		•	1.41 (1.05–1.88)
All Black ethnicities	340 912	268 (0.1%)		1.51 (1.33-1.71)	355625	75 (<0.1%)	-		0.92 (0.73-1.16)
Caribbean	82561	137 (0.2%)		1.33 (1.12–1.58)	84219	44 (0.1%)			0.85 (0.63–1.15)
African	190164	91 (<0.1%)		1.77 (1.43-2.19)	199012	19 (<0.1%)	_	_	0.95 (0.61–1.50)
Other Black	68187	40 (0.1%)		1.61 (1.18-2.20)	72394	12 (<0.1%)			1.08 (0.61–1.90)
All mixed ethnicities	170484	65 (<0.1%)	<b>→</b>	1.41 (1.11–1.81)	179557	26 (<0.1%)			1.24 (0.85-1.83)
White and Caribbean	39208	28 (0.1%)		1.62 (1.12-2.36)	41228	7 (<0.1%)			0.80 (0.38–1.69)
White and African	33194	9 (<0.1%)		1.26 (0.65-2.42)	34991	6 (<0.1%)			→ 1.93 (0.86-4.30)
White and Asian	34264	9 (<0.1%)		1.21 (0.63-2.33)	36257	5 (<0.1%)		•	→ 1.51 (0.63–3.64)
Other mixed ethnicity	63818	19 (<0.1%)		1.31 (0.84-2.06)	67081	8 (<0.1%)			1.35 (0.67–2.70)
All other ethnicities	320788	107 (<0.1%)	<b></b>	1.22 (1.00–1.48)	334962	35 (<0.1%)			0.92 (0.66–1.29
Chinese	103892	20 (<0.1%)	<b>•</b>	1.05 (0.67-1.63)	105658	6 (<0.1%)		_	0.70 (0.31-1.55)
All other ethnic groups	216896	87 (<0.1%)	<b>_</b> •	1.26 (1.01–1.56)	229304	29 (<0·1% <b>)</b>	_	-	0.97 (0.67–1.40)
Jnknown ethnicity	4553051	2961 (0.1%)	+	1.01 (0.97-1.06)	4381803	1824 (<0.1%)	+		1.17 (1.11-1.24)

Figure 4: Ethnic differences in the risk of COVID-19-related death

Models adjust for age, sex, deprivation quintile, all prespecified clinical comorbidities, body-mass index category, glycated haemoglobin category, systolic and diastolic blood pressure category, number of primary care consultations in the previous 12 months, household size, and stratification by sustainability and transformation partnership region. For categories containing small numbers (<5) within any subcategory, we have rounded all counts to the nearest 10, per data disclosure agreements. HR=hazard ratio. \*All White ethnicities is the reference category for comparison of ethnicity in the five broad categories, and White British is the reference category for comparison of ethnicity in the 16 subcategories.

In wave 1, among the 78124 care home residents, 46065 (59.0%) individuals were tested for SARS-CoV-2, 6330 (8.1%) tested positive, 2517 (3.2%) were admitted to hospital, and 3877 (5.0%) died from COVID-19. Although no ethnic differences in being tested for or testing positive for SARS-CoV-2 infection were apparent, people of Black ethnicity (adjusted HR 1.43 [95% CI 1.02-2.00]) and other ethnicity (1.73 [1.19-2.50]) were more likely to die from COVID-19 than people of White ethnicity, after adjustment for all measured explanatory variables except household size. In wave 2, no ethnic differences among care home populations were evident for any outcome except COVID-19 death, which was raised for South Asian groups (1.81 [1.07-3.05]; appendix p 16). Because of small numbers, we were unable to explore ethnic differences in ICU admissions or differences according to ethnicity in 16 categories among care home residents.

Using multiple imputation to account for unknown ethnicity did not materially change any of the associations observed in the complete case analysis (appendix p 17), nor did restricting the definition of COVID-19-related death to underlying cause only (appendix p 18) or removing adjustment for STP region (appendix p 19). We detected no evidence of deviations from the proportional hazards assumption (appendix p 20).

#### Discussion

In a population-based cohort study of 17 million adults in England we found that, although ethnic differences in testing were small, minority ethnic groups were at increased risk of testing positive for SARS-CoV-2 and of COVID-19-related hospitalisation, ICU admission, and death. Disaggregation into detailed ethnic categories revealed important within-group heterogeneity, emphasising the importance of disaggregated reporting wherever possible. In wave 2, minority ethnic groups were less likely to be tested than White groups, and risks of severe COVID-19 outcomes (ie, hospitalisation, ICU admission, and death) increased for South Asian groups but were attenuated in all other ethnic groups relative to the White group compared with wave 1.

In the largest UK-based study to date, we captured high-quality clinical data across a range of health-care settings and linked individual-level COVID-19 datasets, which enabled us to generate timely insights into ethnic disparities at different severity levels of COVID-19, from being tested for infection to dying from the disease. We were able to report findings according to self-reported ethnicity in 16 categories, whereas other UK-based studies have aggregated ethnicity into higher-level groups because of small numbers. We also reported differences in outcomes using a general population-based sample, which allowed us to overcome issues commonly faced by studies limited to individuals with SARS-CoV-2 infection or hospitalisation, wherein the populations under study might not represent the true general population at risk.<sup>31</sup>

Our inability to capture all potential explanatory factors of ethnic disparities in COVID-19 outcomes is likely to have affected our observed associations. For example, we were unable to account for ethnic differences in genetic ancestry,<sup>32,33</sup> occupation,<sup>34</sup> experiences of racism or structural discrimination,<sup>9,35,36</sup> and health-related behaviour.<sup>37,38</sup> Because of invalid address information, we were unable to estimate household size for 13% of our population. We might have underestimated household size for homes including people registered at non-TPP primary care practices and overestimated it for individuals living in large apartment blocks, or for people who had not updated their address after moving homes. In recognition of these limitations, we grouped household size into four levels rather than considering it as a continuous measure. Furthermore, it is possible that cause of death might have been misclassified on death certificates, and that the extent of this misclassification might have differed by time period and ethnicity. A limitation of SARS-CoV-2 testing data was the selective opportunity to be tested early in the pandemic, which was skewed towards health-care workers and people with severe or symptomatic disease, particularly during the first wave. Although OpenSAFELY is broadly representative of the English population, it includes data from a single software system that is known to have lower coverage in London than in other regions of the UK. However, our results mirror other studies done in the UK<sup>1</sup> and in the USA,<sup>5,39</sup> suggesting that potential mechanisms underpinning ethnic differences in COVID-19 might be common across countries with similar population structures. OpenSAFELY data are collected prospectively in real time by clinicians and practice staff, and are subject to the same strengths and biases as other UK-based electronic health record databases.

Despite these limitations, this study represents the most comprehensive examination of ethnic inequalities in England during the COVID-19 pandemic in 2020. Using the OpenSAFELY data analytics platform, we capitalised on the rapid real-time linkage of routine datasets in a highly secure environment to explore a range of urgent questions around the patterning of ethnic inequalities in the UK.

This study builds on previous research in several ways. First, we have confirmed ethnic differences in COVID-19related mortality and provided novel data across a range of other outcomes (testing, hospitalisation, and ICU admission). Second, we have explored whether household size has an effect beyond sociodemographic and clinical characteristics. Finally, we have reported on both the general population and care home residents during the first and second waves of the pandemic in England.

Although some minority ethnic groups were less likely to be tested for SARS-CoV-2 in this study, all non-White groups were more likely to test positive, even when restricted to those ever tested. This finding might suggest that White populations are tested more frequently with mild or asymptomatic disease, or that minority ethnic groups get tested at more severe stages of the disease. Disparities in testing might relate to a lack of access to testing sites, poorer health literacy, lack of tailored and accessible health communications, or differences in testing-related behaviours.<sup>40</sup> Emerging evidence suggests that individuals might avoid seeking a test for fear of losing income or employment if required to guarantine after testing positive.<sup>41</sup> Given that minority ethnic groups are more likely to work in insecure jobs with poor workplace protections, and in essential or key-worker roles associated with higher risk of death from COVID-19,<sup>42–44</sup> it is likely that social and economic barriers to testing are greater in minority ethnic groups.

Our finding that minority ethnic groups have higher risks of COVID-19-related hospitalisation, ICU admission, and death after accounting for clinical comorbidities suggests that improving equity in clinical care and understanding potential interactions between COVID-19 and underlying conditions are essential for mitigating inequalities in the downstream effects of SARS-CoV-2 infection. The fact that inequalities worsened for South Asian groups in wave 2 compared with in wave 1 suggests that more aggressive and tailored interventions are needed to meet the needs in these communities.45 However, our finding of relatively attenuated risks in all other minority ethnic groups is a potential positive finding; further investigation is warranted into which public health actions were most influential in mitigating health disparities for these groups.

Our finding that the magnitude of ethnic differences in testing positive in wave 1 were similar to those in COVID-19-related death suggests that ethnic differences in death might be mediated through exposure or susceptibility to infection, rather than through susceptibility to severe disease once infected. This hypothesis is supported by recent findings from the REACT-2 study, which found higher levels of SARS-CoV-2 antibodies in minority ethnic groups but no ethnic differences in the infection-tomortality ratio.<sup>46</sup>

After accounting for sociodemographic and clinical factors, household size further explained differences in COVID-19 outcomes for South Asian groups. This finding is consistent with an ONS study that found that multigenerational living was causally associated with an increased risk of death due to COVID-19 in South Asian women, but not in any other ethnic groups.<sup>47</sup> According to data from the 2011 census, 21% of South Asian groups live in multigenerational households, in contrast to around 7% of White groups.<sup>24,48</sup> We hypothesise that household size and deprivation might proxy viral exposure by capturing aspects of occupational and community-level exposure. Although multigenerational living might increase the risks of exposure and

transmission (from children or working-age adults to older or vulnerable family members), such households and extended communities also offer valuable informal care networks and facilitate engagement with health and community services.<sup>49</sup> In light of emerging evidence that minority ethnic groups are less likely to take up the COVID-19 vaccine, co-designing culturally competent and non-stigmatising engagement strategies with these communities is increasingly important.<sup>50,51</sup>

National data from England and Scotland have shown that some minority ethnic groups have both better overall health and lower all-cause mortality than White groups.<sup>52,53</sup> We were able to confirm this pattern in our sensitivity analyses, and our findings of disparities in SARS-CoV-2 positivity and COVID-19-related outcomes, some of which have continued to widen over the course of the epidemic in the UK, are, therefore, particularly concerning.

Our findings mirror large studies in the USA, which have found that minority racial and ethnic communities have elevated risks of testing positive for SARS-CoV-2 infection and of COVID-19-related hospitalisation and death that differentially vary over time, even after accounting for sociodemographic characteristics and underlying health conditions.<sup>5,39</sup> These parallel findings suggest that mechanisms underpinning ethnic differences in COVID-19 outcomes in England might be common in other settings, and that learnings across settings should be shared.

Improving the quality and completeness of ethnicity data across health and administrative datasets is essential for building a complete picture of ethnic disparities.<sup>54</sup> Furthermore, although the recording of ethnicity on death certificates has been the norm in Scotland for the past decade, it is only now being considered for use in England.<sup>55–57</sup> Prioritising linkage between health, social, and employment data will be essential in building a complete picture of ethnic differences in COVID-19 risk and outcomes.

Minority ethnic groups in the UK have had disproportionately high levels of poor COVID-19 outcomes, with disparities increasing even within the course of the epidemic for some groups. Reducing ethnic inequalities will need action across a broad range of measures such as addressing the wider adverse effects of disadvantage and structural discrimination, reducing within-household and between-household transmission, and improving control of clinical conditions. The relative importance of each of these measures will differ by both ethnic group and stage of COVID-19 progression. Equality is difficult to achieve, but structural and persistent inequalities must be addressed in a civilised society.

#### Contributors

RM, CTR, KB, RME, LS, BG, BM, HJC, SJWE, KK, DH, and KR conceptualised the study. RM, CTR, AJW, CB, JC, CEM, RME, WJH, BM, and SB curated the data. RM and CTR did the formal analysis. LS, BG, and RME acquired funding for the study. RM, CTR, CEM, and WJH contributed to the investigation. RM, CTR, KB, RME, KK, NC, RG, DH, KR, LS, BG, BM, EJW, HJC, and SJWE contributed to the methodology. RM, LT, AS, AJW, CEM, BG, WJH, SB, and AM contributed to the codelists. RM, CTR, AS, AJW, CEM, BG, and WJH contributed to project administration. CB, JC, BG, BM, SB, and AM contributed to study resources. AJW, CB, JC, DE, PI, CEM, WJH, BG, SB, HIC, NID, RC, IP, FH, and SH contributed to study software, RM and RME contributed to data visualisation. RM wrote the original draft of the manuscript. All authors reviewed and edited the manuscript. CB, LS, BG, and AM were responsible for information governance. RM, LS, and BG are guarantors. All authors had final responsibility for the decision to submit for publication. Per data protection regulations, all authors had full access to the aggregated data used in the study; CTR, CEM, and AJW had access to pseudonymised patient data; and CB, RC, JP, FH, SH, had full unrestricted access to all data underlying the study. A full statement on data access and verification in this study is provided in the appendix (p 21).

#### **Declaration of interests**

BG has received research funding from Health Data Research UK, the Laura and John Arnold Foundation, the Wellcome Trust, the National Institute for Health Research (NIHR) Oxford Biomedical Research Centre, the NHS NIHR School of Primary Care Research, the Mohn-Westlake Foundation, the Good Thinking Foundation, the Health Foundation, and WHO; and receives personal income from speaking and writing for lay audiences on the misuse of science. IJD has received unrestricted research grants from and holds shares in GlaxoSmithKline. KK is the director for the University of Leicester Centre for BME Health. Trustee of the South Asian Health Foundation, the NIHR Applied Research Collaboration lead for Ethnicity and Diversity, and a member of the Independent Scientific Advisory Group for Emergencies (SAGE) and chair for the SAGE Ethnicity Subgroup. RM, BG, and RME are members of the SAGE Ethnicity Subgroup. RM reports personal fees from AMGEN. AS is employed by the London School of Hygiene & Tropical Medicine (LSHTM) on a fellowship sponsored by GlaxoSmithKline. All other authors declare no competing interests.

#### Data sharing

All data were linked, stored, and analysed securely within the OpenSAFELY platform. Detailed pseudonymised patient data are potentially reidentifiable and therefore not shared. We rapidly delivered the OpenSAFELY data analysis platform without previous funding to deliver timely analyses of urgent research questions in the context of the global COVID-19 health emergency: now that the platform is established, we are developing a formal process for external users to request access in collaboration with NHS England. Details of this process will be published in the near future on the OpenSAFELY website (https://opensafely.org/).

#### Acknowledgments

This work was supported by the UK Medical Research Council (MRC; grant number MR/V015737/1). RM holds a fellowship funded by the Wellcome Trust (201375/Z/16/Z). BG's work on better use of data in health care more broadly is currently funded in part by the NIHR Oxford Biomedical Research Centre, the NIHR Applied Research Collaboration Oxford and Thames Valley, the Mohn-Westlake Foundation, NHS England, and the Health Foundation; all DataLab staff are supported by BG's grants on this work. AS is employed by LSHTM on a fellowship sponsored by GlaxoSmithKline. KB holds a Sir Henry Dale fellowship jointly funded by Wellcome and the Royal Society. HIM is funded by the NIHR Health Protection Research Unit in Immunisation, a partnership between Public Health England and LSHTM. AYSW holds a fellowship from the British Heart Foundation. EJW holds grants from the MRC. IJD holds grants from the NIHR and GlaxoSmithKline. HF holds a UK Research and Innovation fellowship. RME is funded by Health Data Research UK and the MRC. The views expressed are those of the authors and not necessarily those of the NIHR, NHS England, Public Health England, or the Department of Health and Social Care. TPP provided technical expertise and infrastructure within their data centre pro bono in the context of a national emergency. The authors are very grateful for all the support received from the TPP Technical Operations team throughout this work, and for generous assistance from the information governance and database teams at NHS England and NHSX.

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