Ethnic inequalities in positive SARS-CoV-2 tests, infection prognosis, COVID-19 hospitalisations and deaths: analysis of 2 years of a record linked national cohort study in Scotland

Sarah Amele,1 Eliud Kibuchi1,2, Ronan McCabe3, Anna Pearce1, Paul Henery2, Kirsten Hainey1, Adeniyi Francis Fagbamigbe4, Amanj Kurdi5,6, Colin McCowan7, Colin R Simpson8,9, Chris Dibben10, Duncan Buchanan11, Evangelia Demou2,1, Fatima Almaghrabi8, Gina Anghelescu12, Harry Taylor13, Holly Tibble8, Igor Rudan8, James Nazroo14, Laia Bécares13, Luke Daines8, Patricia Irizar14, Sandra Jayacodi15, Serena Pattaro12, Aziz Sheikh8, Srinivasa Vittal Katikireddi2,1

Correspondence to Eliud Kibuchi, MRC/CSO Social and Public Health Sciences, University of Glasgow, College of Medical Veterinary Sciences, University of Glasgow, Social and Public Health Sciences, University of Glasgow, Glasgow G12 8TB, UK; Eliud.Kibuchi@glasgow.ac.uk

SA and EK contributed equally.

Received 28 February 2023
Accepted 17 July 2023

ABSTRACT
Background This study aims to estimate ethnic inequalities in risk for positive SARS-CoV-2 tests, COVID-19 hospitalisations and deaths over time in Scotland.

Methods We conducted a population-based cohort study where the 2011 Scottish Census was linked to health records. We included all individuals ≥16 years living in Scotland on 1 March 2020. The study period was from 1 March 2020 to 17 April 2022. Self-reported ethnic group was taken from the census and Cox proportional hazard models estimated HRs for positive SARS-CoV-2 tests, hospitalisations and deaths, adjusted for age, sex and health board. We also conducted separate analyses for each of the four waves of COVID-19 to assess changes in risk over time.

Findings Of the 4 358 339 individuals analysed, 1 093 234 positive SARS-CoV-2 tests, 37 437 hospitalisations and 14 158 deaths occurred. The risk of COVID-19 hospitalisation or death among ethnic minority groups was often higher for White Gypsy/Traveller (HR 2.21, 95% CI (1.61 to 3.06)) and Pakistani 2.09 (1.90 to 2.29) groups compared with the white Scottish group. The risk of COVID-19 hospitalisation or death following confirmed positive SARS-CoV-2 test was particularly higher for White Gypsy/Traveller 2.55 (1.81–3.58), Pakistani 1.75 (1.59–1.73) and African 1.61 (1.28–2.03) individuals relative to white Scottish individuals. However, the risk of COVID-19-related death following hospitalisation did not differ. The risk of COVID-19 outcomes for ethnic minority groups was higher in the first three waves compared with the fourth wave.

Interpretation Most ethnic minority groups were at increased risk of adverse COVID-19 outcomes in Scotland, especially White Gypsy/Traveller and Pakistani groups. Ethnic inequalities persisted following community infection but not following hospitalisation, suggesting differences in hospital treatment did not substantially contribute to ethnic inequalities.

WHAT IS ALREADY KNOWN ON THIS TOPIC
- Ethnic minority groups are disproportionately at a higher risk of COVID-19 outcomes in the UK.
- Most studies have focused on aggregated categories of ethnicity, which has often masked important heterogeneity in COVID-19 outcomes among ethnic minorities.
- Most studies on ethnic inequalities in COVID-19 outcomes have focused on differences in incidence, with less evidence on differences following confirmed positive SARS-CoV-2 test and COVID-19-related hospitalisation.

WHAT THIS STUDY ADDS
- We investigated ethnic inequalities in positive SARS-CoV-2 tests, severe COVID-19 (hospitalisation or death) and COVID-19 hospitalisation or death following a confirmed positive SARS-CoV-2 test and death in Scotland.
- We found heterogeneity in risks of COVID-19 outcomes within subcategories of aggregated ethnic groups.
- Ethnic minority groups experienced higher risks of COVID-19 hospitalisation or death, which persisted after restricting analyses to those with a confirmed positive SARS-CoV-2 test.

HOW THIS STUDY MIGHT AFFECT RESEARCH, PRACTICE OR POLICY
- This finding is important for policy-making, as it shows the existence of differences in risk within aggregated ethnic groups and the need for tailored interventions.

INTRODUCTION
Data from several countries have highlighted the disproportionate impact of SARS-CoV-2 infection and COVID-19 among some ethnic minority groups.14 Reasons for the variation observed between ethnic minority groups include...
differences in exposure to SARS-CoV-2, differential vulnerability to COVID-19 disease due to pre-existent health and socio-economic disadvantage, differential outcomes to the racialised public health responses to control the pandemic and differential exposure to vaccines, monoclonal antibodies and antiviral treatments. In the UK, previous work has shown COVID-19 has particularly affected Pakistani, Bangladeshi and black African and Caribbean populations disproportionately. Understanding at which stage ethnic inequalities in COVID-19 outcomes arise can help inform policy within this pandemic and in the future. The majority of the previous literature on ethnic inequalities in COVID-19 outcomes has focused on differences in incidence, whereas the literature on differences in prognosis (ie, outcomes after confirmed positive SARS-CoV-2 tests and COVID-19-related hospitalisation) is limited. Moreover, a clear understanding of changes in ethnic inequalities across COVID-19 waves can potentially provide insights into how policies may have exacerbated or mitigated inequalities over time and provide insight to help drive improvements in the delivery of care.

COVID-19 studies have mainly focused on broad categories of ethnicity due to the poor quality of coding within many health datasets, small sample sizes of ethnic minority groups, and undertheorised approaches to ethnic inequalities across these groups. This may often lead to an underestimation of the magnitude of ethnic inequalities in health, since broad categories often mask important heterogeneity. For example, some white ethnicity groups who have poorer health profiles than the white majority population are often ignored. This necessitates the use of more specific ethnic subcategories, which allows for a more granular exploration of ethnic inequalities compared with broad categories. This can be achieved by linking health datasets to self-reported ethnicity from the census, which will improve epidemiological surveillance.

This study aimed to investigate ethnic inequalities in positive SARS-CoV-2 tests and severe COVID-19 outcomes (hospitalisations or deaths) in Scotland. Also, COVID-19 hospitalisations or deaths following a confirmed positive SARS-CoV-2 test, and deaths following COVID-19 hospitalisation, were explored. We additionally evaluated changes in ethnic inequalities over time across the four waves of increased transmission of COVID-19.

METHODS

Study design and population

Data from the Early Pandemic Evaluation and Enhanced Surveillance of COVID-19 (EAVE II) study were linked to the 2011 Scottish Census, which was the source for the study’s primary exposure (ethnicity). We included all individuals who were alive, aged ≥16 years and residents of Scotland on 1 March 2020. The study period was from 1 March 2020 (date of first COVID-19 case in Scotland) to 17 April 2022.

The EAVE-II study includes approximately 99% of the Scottish population and includes primary care, testing, vaccination, hospitalisation and mortality data. These data are linked together using the Community Health Index (CHI), a unique numeric identifier used by National Health Service Scotland within health records, which records registrations and deregistration with primary and secondary care services. SARS-CoV-2 testing data were taken from the Electronic Communication of Surveillance in Scotland, morbidity and mortality data from Scottish Morbidity Record and National Records of Scotland datasets, respectively.

The 2011 Scottish Census took place on 27 March 2011 and achieved an overall response rate of 94% among the estimated population of 5.3 million individuals. Ethnic classification was based on 16 groups, with ethnic minority groups constituting 4% of the Scottish population. The approximate linkage rate of 2011 census to the EAVE-II study datasets was 94%.

Outcomes

The primary outcome was COVID-19-related hospitalisation or death (severe COVID-19). We also explored COVID-19 hospitalisation and death as separate outcomes, in addition to RT-PCR confirmed positive SARS-CoV-2 test. It is important to note that a ‘positive SARS-CoV-2 test’ represents having tested positive for SARS-CoV-2, which requires individuals to have been first tested. A COVID-19-related hospitalisation was defined based on the International Classification of Diseases—10 code (U07.1 and U07.2) as the reason for admission (any position), or presence of an RT-PCR confirmed positive test for SARS-CoV-2 in the 28 days prior to admission. COVID-19-related death was defined as either a death where U07.1 and U07.2 were recorded as the primary or secondary causes of death or any death where the individual had a positive RT-PCR test for SARS-CoV-2 infection in the 28 days prior to death. We also undertook a sensitivity analysis where a positive SARS-CoV-2 test was listed as the only primary cause of COVID-19-related hospitalisation or death. In this case, we did not include COVID-19-related hospitalisations or death that preceded a confirmed positive SARS-CoV-2 test.

To understand pathways to ethnic inequalities, we also calculated differences in the risk of COVID-19-related hospitalisation or death following confirmed positive SARS-CoV-2 test and COVID-19-related deaths following confirmed COVID-19-related hospitalisation.

Ethnicity

Self-reported ethnicity was defined based on 5 aggregated categories (and 16 disaggregated subcategories) in the 2011 Scottish Census classification:

- White: white Scottish, white other British, white Irish, White Gypsy/Traveller, white Polish, other white.
- Mixed or multiple ethnic groups (hereafter mixed).
- Asian: Pakistani, Pakistani Scottish or Pakistani British (Pakistani), Indian, Indian Scottish or Indian British (Indian), Bangladeshi, Bangladeshi Scottish or Bangladeshi British (Bangladeshi), Chinese, Chinese Scottish or Chinese British (Chinese), other Asian.
- Other ethnic groups (hereafter other): Arab, Arab Scottish or Arab British (Arab) and other disaggregated.

For the analyses of aggregated groups, ethnicity was determined using the 2011 Scottish Census as the default choice and supplemented by a Public Health Scotland (PHS) ethnicity look-up variable, which was used to impute missing values. The PHS ethnicity look-up variable was generated using the most recent ethnicity data from primary care, hospitalisations, secondary care, outpatients, laboratory and unscheduled care. When carrying out disaggregated analyses, we considered only those individuals with non-missing ethnicity values in the 2011 census due to the likely misclassification of more specific ethnic groups within health datasets. Individuals with missing disaggregated ethnic data were those who responded...
to the 2011 census but did not provide their ethnicity. Ethnic differences in baseline characteristics were described based on age and sex.

Statistical analysis
Baseline characteristics (as of 1 March 2020) were presented using summary statistics per ethnic group. Differences in COVID-19 outcomes: confirmed infection, hospitalisation, death and both hospitalisation and death were also described by ethnicity.

We used Cox proportional models to estimate HRs with 95% CI for the risk of each of the COVID-19 outcomes by ethnicity. Analyses were conducted for the full study period (1 March 2020 to 17 April 2022). Secondary analyses to assess differences across the four waves of increased transmission of COVID-19: wave 1 (1 March 2020 to 31 July 2020), wave 2 (1 August 2020 to 30 April 2021), wave 3 (1 May 2021 to 17 December 2021) and wave 4 (18 December 2021 to 17 April 2022) were also undertaken.13

All analyses were adjusted for age (5-year bands), sex and health board (a regional authority in Scotland with responsibility for the delivery of health services). Since ethnicity is a complex and multidimensional social construct, we did not adjust for variables such as socioeconomic position or clinical risk factors because they are mediating variables for ethnic inequalities and their inclusion may result in misleading interpretations due to overadjustment.3 We did a sensitivity analysis excluding the health board, as it was unclear if it could be a mediator or not. Individuals were followed from the beginning of the study period until their first event of interest or the end of the study period (17 April 2022), whichever occurred first. Observations and events for ethnic groups containing small numbers (≤10) were removed as per data disclosure agreements. All analyses were conducted in the Scottish National Safe Haven using R statistical software (V.4.0.2), with R codes available on https://github.com/Kibuchi-eluid/Ethnic_inequalities_in_Scotland_COVID19.git in GitHub.

RESULTS
A total of 5,121,530 individuals were registered in the Scottish CHI on 1 March 2020 (figure 1) and were therefore considered the eligible population. We excluded 712,053 (13.90%) individuals with unavailable ethnicity values in either census or PHS look-up file. Also, 51,138 (1.00%) individuals with health board missing values were excluded. Of the total eligible population, 4,358,339 (85.10%) made up the final cohort to study aggregated groups; 1,093,234 (21.55%) had confirmed positive SARS-CoV-2 tests and 37,569 (0.73%) had a confirmed hospitalisation. The final cohort with complete disaggregated subcategories consisted of 3,730,837 (72.83%) individuals; of which 915,453 (17.87%) and 33,640 (0.66%) had confirmed positive SARS-CoV-2 test and hospitalisation, respectively.

Most of the study population (95.0%) were white, followed by Asian (3.1%), black or African (0.8%) and mixed (0.5%) (table 1). There were slightly more females (51.8%) than males (48.2%), and the mean age was highest in the white group (50.0 years, SD=19.3) and lowest in the mixed group (34.5 years, SD=14.1). The characteristics of disaggregated groups were suppressed as per disclosure policy.

Ethnic minority groups had higher risks of COVID-19 hospitalisation or death after adjusting for age, sex and health board, especially White Gypsy/Traveller adjusted HR 2.30 (95% CI: 1.67 to 3.17), Pakistani 2.11 (1.92 to 2.32), Bangladesh 1.84 (1.18 to 2.89), other Asian 1.29 (1.03 to 1.63) and African 1.41 (1.13 to 1.77), relative to white Scottish (figure 2, online supplemental tables S1 and S2). In contrast, the Chinese group had a lower risk 0.65 (0.51–0.82). The pattern of risks for hospitalisations only was similar to the combined risk of hospitalisations or deaths across the disaggregated groups. For COVID-19-related death, the risks were elevated for Pakistani 2.20 (1.79–2.70) and other Asian 1.80 (1.10–2.94) groups relative to white Scottish. The risks of confirmed positive SARS-CoV-2 test were lower across all disaggregated minority groups compared with the white Scottish.

For the aggregated groups, Asian: 1.26 (1.18–1.46), black or African: 1.35 (1.17–1.56) and other 1.26 (1.06–1.50) ethnic
Table 1 Baseline characteristics by aggregated ethnic group as at 1 March 2020

<table>
<thead>
<tr>
<th>Ethnic group</th>
<th>White, n (%)</th>
<th>Mixed, n (%)</th>
<th>Asian, n (%)</th>
<th>Black or African, n (%)</th>
<th>Other group, n (%)</th>
<th>Total, n (%)</th>
</tr>
</thead>
<tbody>
<tr>
<td>Total</td>
<td>4142573</td>
<td>22379</td>
<td>135729</td>
<td>32933</td>
<td>24725</td>
<td>435833</td>
</tr>
<tr>
<td>Sex</td>
<td></td>
<td></td>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Male</td>
<td>1995806</td>
<td>104456</td>
<td>65716</td>
<td>16565 (50.3)</td>
<td>12685 (51.3)</td>
<td>2101217</td>
</tr>
<tr>
<td>Female</td>
<td>2146767</td>
<td>119394</td>
<td>70013</td>
<td>16386 (49.7)</td>
<td>12040 (48.7)</td>
<td>2257122</td>
</tr>
<tr>
<td>Age in years</td>
<td>Mean</td>
<td>50.0</td>
<td>34.5</td>
<td>39.2</td>
<td>38.40</td>
<td>37.7</td>
</tr>
<tr>
<td></td>
<td>5D</td>
<td>19.3</td>
<td>14.1</td>
<td>15.4</td>
<td>13.10</td>
<td>13.8</td>
</tr>
<tr>
<td>COVID-19 outcomes</td>
<td>Hospitalisations or deaths</td>
<td>41247 (1.0)</td>
<td>85 (0.4)</td>
<td>913 (0.7)</td>
<td>183 (0.6)</td>
<td>130 (0.5)</td>
</tr>
<tr>
<td></td>
<td>Hospitalisations</td>
<td>34983 (0.8)</td>
<td>81 (0.4)</td>
<td>850 (0.6)</td>
<td>181 (0.5)</td>
<td>*</td>
</tr>
<tr>
<td></td>
<td>Deaths</td>
<td>13393 (0.3)</td>
<td>11 (0.1)</td>
<td>187 (0.1)</td>
<td>11 (0.1)</td>
<td>*</td>
</tr>
<tr>
<td>Positive SARS-CoV-2 test</td>
<td>Hospitalisations or deaths</td>
<td>1013428 (24.5)</td>
<td>6047 (27.0)</td>
<td>37744 (24.9)</td>
<td>9229 (28.0)</td>
<td>6097 (24.7)</td>
</tr>
<tr>
<td></td>
<td>Hospitalisations</td>
<td>37839 (0.9)</td>
<td>81 (0.4)</td>
<td>864 (0.6)</td>
<td>176 (0.5)</td>
<td>123 (0.5)</td>
</tr>
<tr>
<td></td>
<td>Deaths</td>
<td>11522 (0.3)</td>
<td>10 (0.1)</td>
<td>168 (0.1)</td>
<td>11 (0.1)</td>
<td>*</td>
</tr>
<tr>
<td>Confirmed COVID-19 hospitalisations</td>
<td>Deaths</td>
<td>7129 (0.2)</td>
<td>124 (0.6)</td>
<td>*</td>
<td>*</td>
<td>*</td>
</tr>
</tbody>
</table>

*Small numbers not allowable for disclosure release.

Figure 2 Ethnic differences in the risk of COVID-19-related outcomes for: (A) hospitalisation or death, (B) hospitalisation, (C) death and (D) positive SARS-CoV-2 test. Models adjusted for age, sex and health board. Data are observations and events. Observations and Events for ethnic groups containing small numbers (≤10) were removed as per data disclosure agreements and indicated by only |. White ethnic group is the reference category for comparison of ethnicity in the aggregated categories, and white Scottish is the reference category for comparison of ethnicity in the disaggregated subcategories.
groups had higher risks of COVID-19 hospitalisation or death relative to the white group. The pattern for COVID-19 hospitalisation only was similar to hospitalisations or deaths for the aggregated groups. The risk of COVID-19-related deaths was higher in the Asian group 1.19 (1.03–1.38) compared with the white group, while risk did not significantly differ in the black or African 0.57 (0.32–1.04) and other 0.48 (0.24–0.95) groups relative to white group. The risk of positive SARS-CoV-2 test was lower across all minority groups compared with the white group. Sensitivity analysis results where the primary cause of hospitalisation or death was solely COVID-19 (online supplemental figure S1, online supplemental tables S3 and S4) were slightly elevated when compared with those obtained when COVID-19-related admission was from any position. However, the overall risk pattern across ethnic groups was similar.

Relative to the white group, ethnic minority groups were more likely to be hospitalised or die following a positive SARS-CoV-2 test (figure 3, online supplemental tables S5 and S6). The difference in risks for hospitalisations or deaths following positive SARS-CoV-2 test was slightly higher compared with those obtained for the unrestricted population. The pattern for the risk of COVID-19-related deaths was also similar to that of the unrestricted population.

Across disaggregated groups, the risks of hospitalisation or death following confirmed positive SARS-CoV-2 test for White Gypsy-Traveller 2.55 (1.81–3.58), Pakistani 1.75 (1.59–1.93), Bangladeshi 1.65 (1.03–2.66), other Asian 1.41 (1.11–1.78), African 1.61 (1.28–2.03) and Arab 1.54 (1.08–2.19) groups were higher relative to white Scottish. These risks were slightly higher compared with those for incidence among the whole population, especially among the Arab group. The pattern of risks for hospitalisations for disaggregated subcategories were similar to those for hospitalisations or deaths following positive SARS-CoV-2 test. The risks of COVID-19-related deaths following confirmed positive SARS-CoV-2 test were higher for White Gypsy-Traveller and Pakistani groups relative to white Scottish, and slightly higher compared with those obtained from the whole population. The risk for death for Chinese 2.05 (1.40–2.98) and other Asian 1.75 (1.08–2.81) groups was greater than those seen for incidence among the whole population.

Figure 3  Ethnic differences in the risk of COVID-19-related outcomes for: (A) hospitalisation or death following confirmed infection, (B) hospitalisation following confirmed positive SARS-CoV-2 test, (C) death following confirmed positive SARS-CoV-2 test and (D) death following COVID-19 hospitalisation. Models adjusted for age, sex and health board. Data are observations and events. Observations and Events for ethnic groups containing small numbers (≤10) were removed as per data disclosure agreements and indicated by only |. White ethnic group is the reference category for comparison of ethnicity in the aggregated categories, and white Scottish is the reference category for comparison of ethnicity in the disaggregated subcategories.
The risk of death following COVID-19 hospitalisation did not differ for Asian and black or African groups when compared with the white group. However, the other group had a lower risk 0.37 (0.15–0.88). Across disaggregated, ethnic minority groups had similar risks to the white Scottish, except among the Chinese 1.73 (1.12–2.82) and other Asian 1.83 (1.08–3.10) groups where risks were slightly higher. Where the primary cause of hospitalisation or death was solely COVID-19 (online supplemental figure S2 and tables S7 and S8), the estimates were similar to those obtained when COVID-19 was included alongside other conditions.

Ethnic minority groups experienced a higher risk of hospitalisations or deaths at the start of the pandemic (ie, waves 1–3), which was no longer present by wave 4, except among the White Gypsy/Traveller group (figure 4, online supplemental tables S9 and S10). The risk of death among white Polish was higher in wave 3 compared with white Scottish 2.99 (1.75–5.09) despite not being different over the whole period. For positive SARS-CoV-2 test, the Indian, other Asian and African groups started out with a higher risk compared with the white Scottish group, but ended up with a lower risk in wave 4. This is in contrast with the lower risks of confirmed infections observed over the whole period.

**DISCUSSION**

In this whole population study of ethnic inequalities in COVID-19 outcomes in Scotland, we have found heterogeneity in risks of severe COVID-19 outcomes across ethnic minority groups with White Gypsy/Traveller and Pakistani groups having particularly higher risks compared with white Scottish groups. Moreover, for aggregated groups, the risk of severe COVID-19 outcomes was higher in Asian and black or African groups compared with the white group. The higher risks of COVID-19 hospitalisation or deaths experienced by ethnic minority groups in the whole population persisted when analyses were restricted to those with confirmed positive SARS-CoV-2 test. However, no ethnic differences in the risk of COVID-19-related deaths were found following COVID-19 hospitalisation. Comparisons across the four waves of the pandemic revealed a higher risk of COVID-19 outcomes for ethnic minority groups in the first three waves, which lessened over time.

Our findings show that ethnic minority groups have a greater risk of severe COVID-19-related outcomes are consistent with previous findings conducted in England using linked census data. This has been associated with high rates of existing chronic conditions and worse socioeconomic position experienced by ethnic minority groups, with racism as an underlying contributor to both socioeconomic inequalities and chronic conditions. The identification that the White Gypsy/Traveller and Pakistani groups have a particularly higher risk of severe COVID-19 outcomes confirms the possibility that important heterogeneity in risks across subcategories of ethnic minority groups is hidden when aggregated groups are used in analysis.

This finding is important because a recent systematic review identified only a few studies exploring ethnic inequalities in COVID-19 outcomes across ethnic subcategories, with white ethnic minority groups rarely studied. Most studies have assessed inequalities in incidence, but fewer have looked at prognosis, which might help indicate how equitable healthcare is. Our findings are consistent with the...
broaden evidence showing the existence of ethnic inequalities in COVID-19-related hospitalisation and deaths.4,21 This suggests that ethnic minority groups experience underdiagnosis and are likely to face barriers to testing, which relates to their lower infection risk observed in this study.17,22 However, it is unclear if differential exposure and vulnerability to infection/disease accounts for all ethnic inequalities or if differential consequences of disease do also contribute.

Our findings that ethnic minority groups have no increased risk of death following hospitalisation are consistent with results of two systematic reviews.4,21 This suggests that secondary care provided for COVID-19 patients in Scotland is equitable across ethnic groups as has also been shown in England.4,21 However, Chinese and other Asian groups were more likely to die following hospitalisation, despite having a lower risk of hospitalisation compared with white Scottish individuals. This may be caused either by higher morbidity or severity of symptoms at the point of admission.

It was clear that ethnic minority groups had an increased risk of COVID-19 outcomes at the beginning of the pandemic (ie, waves 1–3). However, this risk reduced by wave 423,24 which may reflect either acquired herd immunity due to vaccination efforts and infection25 or decreasing severity of new variants.25–27

Strengths and limitations
First, we used self-reported ethnicity from the 2011 Scottish National Census linked with timely COVID-19 primary care, testing, vaccination, hospitalisation and mortality data. This reduces the risk of ethnic groups being misclassified, especially when analysing disaggregated ethnic groups. Second, this study is population based with nationwide coverage, which reduces the risk of selection bias of the individuals included in the study. Third, we also explored ethnic inequalities in COVID-19 outcomes for subpopulations following confirmed positive SARS-CoV-2 test and following COVID-19 hospitalisation. This is important for policy-making as it shows at which stage to implement policies aimed at reducing ethnic inequalities for COVID-19 and future pandemics.

Our study has a few limitations. First, the analysis data only contains information about people who were enumerated during the 2011 Scottish Census and recorded in the CHI register as of 1 March 2020. Therefore, the disaggregated analyses excluded an estimated 6% of people who were living in Scotland in 2011 but did not take part in the 2011 census. We also excluded census respondents who could not be linked to the EAVE-II data, and people who emigrated since 2011.14,15 We also only consid- ered adults (aged >16 years) in the analyses because COVID-19 outcomes tend to be less severe in children.28 Second, out- migration may not have been fully captured through the CHI register, since we are only able to look at recorded infections and not undiagnosed. The existence of redundant and historic CHIs inflated the number of individuals in the cohort, which may have led to biased estimates. In addition, we may have failed to capture migrants who were not registered with a general prac- tice due to a lack of documentation. Third, there is the potential of selection bias in the estimated risks caused by people who did not take part in the census, those who did not link to the census (ie, linkage bias) and recent migrants who did not participate in the 2011 census.29 Finally, the risk of positive SARS-CoV-2 test represents the risk of testing positive, which may be susceptible to bias due to ethnic differences in the use of the testing system. In turn, this may have led to biased estimates of the risk of hospitalisation or death following a confirmed positive SARS-CoV-2 test. However, despite these limitations, this paper presents a comprehensive analysis of inequalities faced by ethnic minorities during the COVID-19 pandemic in Scotland.

CONCLUSIONS
In conclusion, the risks of COVID-19-related outcomes were higher in some ethnic minority groups in Scotland, in particular among the White Gypsy/Traveller and Pakistani groups. Ethnic minority groups experienced higher risks of severe COVID-19 even after restricting to confirmed infections, indicating that community care is a contributing factor to these inequalities. However, inequalities in COVID-19-related deaths were not observed following hospitalisation, suggesting the provision of secondary care did not contribute to ethnic variations. We recommend future research to understand mediating pathways that generate these ethnic inequalities in COVID-19.

Author affiliations
1MRC/CSO Social and Public Health Science Unit, School of Health and Wellbeing, University of Glasgow, Glasgow, UK
2Public Health Scotland, Glasgow Office, Glasgow, UK
3Institute of Applied Health Sciences, University of Aberdeen, Aberdeen, UK
4Department of Epidemiology and Medical Statistics, Faculty of Public Health, College of Medicine, University of Ibadan, Ibadan, Oyo, Nigeria
5Strathclyde Institute of Pharmacy & Biomedical Sciences (SIPBS), Faculty of Science, University of Strathclyde, Glasgow, UK
6Department of Pharmacology, College of Pharmacy, Hawler Medical University, Erbil, Kurdistan, Iraq
7School of Medicine, University of St Andrews, St Andrews, UK
8Usfer Institute of Population Health Sciences and Informatics, The University of Edinburgh, Edinburgh, UK
9School of Health, Wellington Faculty of Health, Victoria University of Wellington, Wellington, New Zealand
10Centre for Research on Environment, Society and Health, School of GeoSciences, Institute of Geography, University of Edinburgh, Edinburgh, UK
11Research Data Scotland, Edinburgh, UK
12Scottish Centre for Administrative Data Research (SCADR), University of Glasgow, Glasgow, UK
13Department of Global Health and Social Medicine, King’s College London, London, UK
14Department of Sociology, School of Social Sciences, The University of Manchester, Manchester, UK
15Patient and Public Involvement (PPI) Representative, Non affiliated, Glasgow, UK

Twitter Srinivasa Vittal Katikireddi @vkatikireddi

Acknowledgements The authors would like to acknowledge the eDRIS team (Public Health Scotland) for their support in obtaining approvals, the provisioning and linking of data and facilitating access to the National Safe Haven.

Contributors Guarantor: SVK. SVK conceived the idea for the study, SA drafted the analysis plan, SA and EK conducted the analysis and drafted the paper, SA, EK and RM conducted data management, RM, AP, PH, KH, AFE, AK, CM, CRS, DC, DB, FA, GA, HTaylor, HTibble, IR, JN, LB, LD, PI, SJ, SP, ED and AS contributed to the critical revision of the manuscript. All authors approved the final manuscript.

Funding This work was supported by the ESRC (grant number ES/W000849/1). The funders had no role in the study design, data collection and analysis, decision to publish, or preparation of the manuscript. SA, EK, RM, AP, KH, ED and SVK are supported by Medical Research Council (MC_UU_00022/2) and the Scottish Government Chief Scientist Office (SPhS17). SVK acknowledges funding from a National Records of Scotland Senior Clinical Fellowship (SCAF/15/02), the Medical Research Council (MC_UU_00022/2) and the Scottish Government Chief Scientist Office (SPhS17). AP acknowledges funding from Wellcome Trust (205412/21/16/2).

Competing interests SVK was cochair of the Scottish Government’s Expert Reference Group on Ethnicity and COVID-19 and a member of the Scottish Advisory Group on Emergencies subgroup on ethnicity.

Patient consent for publication Not applicable.

Ethics approval This study involves human participants. The Public Benefit and Privacy Panel Committees of Public Health Scotland and Scottish Government approved the linkage and analysis of the deidentified datasets for this project (2021-0115). Participants gave informed consent to participate in the study before taking part.
Provenance and peer review Not commissioned; externally peer reviewed.

Data availability statement Data may be obtained from a third party and are not publicly available. Under the provisions of the Statistics and Registration Service Act 2007, the linked 2011 census data used in this study are not permitted to be shared.

Supplemental material This content has been supplied by the author(s). It has not been vetted by BMJ Publishing Group Limited (BMJ) and may not have been peer-reviewed. Any opinions or recommendations discussed are solely those of the author(s) and are not endorsed by BMJ. BMJ disclaims all liability and responsibility arising from any reliance placed on the content. Where the content includes any translated material, BMJ does not warrant the accuracy and reliability of the translations (including but not limited to local regulations, clinical guidelines, terminology, drug names and drug dosages), and is not responsible for any error and/or omissions arising from translation and adaptation or otherwise.

Open access This is an open access article distributed in accordance with the Creative Commons Attribution 4.0 Unported (CC BY 4.0) license, which permits others to copy, redistribute, remix, transform and build upon this work for any purpose, provided the original work is properly cited, a link to the licence is given, and indication of whether changes were made. See: https://creativecommons.org/licenses/by/4.0/.

ORCID iDs
Eliid Kibuchi http://orcid.org/0000-0002-5091-6450
Ronan McCabe http://orcid.org/0000-0001-8649-6913
Anna Pearce http://orcid.org/0000-0003-0085-5263
Colin R Simpson http://orcid.org/0000-0002-5194-8083
Duncan Buchanan http://orcid.org/0000-0001-6784-0034
Evangelia Demou http://orcid.org/0000-0001-8616-525X
James Nazroo http://orcid.org/0000-0001-6744-2207
Srinivasa Vittal Katikireddi http://orcid.org/0000-0001-6593-9092

REFERENCES