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A National Audit of Pancreatic Enzyme Prescribing in Pancreatic Cancer from 2015 to 2023 in England Using OpenSAFELY-TPP

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ABSTRACT

Objectives: Cancer treatments were variably disrupted during the coronavirus disease 2019 (COVID-19) pandemic. UK guidelines recommend pancreatic enzyme replacement therapy (PERT) to all people with unresectable pancreatic cancer. The aim was to investigate the impact of the COVID-19 pandemic on PERT prescribing to people with unresectable pancreatic cancer and to investigate the national and regional rates from January 2015 to January 2023.

Data Sources: With the approval of NHS England, we conducted this study using 24 million electronic health records of people within the OpenSAFELY-TPP research platform. There were 22,860 people diagnosed with pancreatic cancer in the study cohort. We visualized the trends over time and modeled the effect of the COVID-19 pandemic with the interrupted time-series analysis.

Conclusion: In contrast to many other treatments, prescribing of PERT was not affected during the pandemic. Overall, since 2015, the rates increased steadily over time by 1% every year. The national rates ranged from 41% in 2015 to 48% in early 2023. There was substantial regional variation, with the highest rates of 50% to 60% in West Midlands.

Implications for Nursing Practice: In pancreatic cancer, if PERT is prescribed, it is usually initiated in hospitals by clinical nurse specialists and continued after discharge by primary care practitioners. At just under 50% in early 2023, the rates were still below the recommended 100% standard. More research is needed to understand barriers to prescribing of PERT and geographic variation to improve quality of care. Prior work relied on manual audits. With OpenSAFELY, we developed an automated audit that allows for regular updates (<https://doi.org/10.53764/rpt.a0b1b51c7a>).

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Introduction

Worldwide, there are around half a million new pancreatic cancer diagnoses every year (including 10,000 in the UK and 60,000 in the US).^{1,2} Currently, surgery is the only curative option, but with 85% to 90% of people diagnosed too late for surgical resection, pancreatic cancer has the lowest (9%) 5-year survival rate among all the cancers.²

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Treatment options available to people with unresectable pancreatic cancer are palliative in nature and include symptom and pain management. Deficiency in the endocrine and exocrine functions of the pancreas has implications for pancreatic cancer care. Diabetes presents commonly, and there are well-established treatment pathways. Pancreatic exocrine failure, or insufficiency, is less well treated.³⁻⁵

There is clear evidence that untreated insufficient digestive enzyme production results in dramatic weight loss, malnutrition, and impaired quality of life via gastrointestinal symptoms and, in pancreatic cancer, contributes to cachexia and frailty.^{6,7} In pancreatic cancer, pancreatic enzyme replacement therapy (PERT) can help improve nutritional status and well-being and, as a result, the ability to tolerate the disease and treatment.^{3,8-10} A meta-analysis of the effect of PERT demonstrated a survival benefit of several months among patients with unresectable pancreatic cancer.¹¹ This survival advantage is of similar magnitude to that associated with palliative chemotherapy.¹¹ The first UK pancreatic cancer guidelines published by the National Institute for Health and Care Excellence (NICE) in February 2018 recommend PERT to people with pancreatic cancer.¹² Subsequently, a Quality Standard (QS177 #4) was published by NICE in December 2018 to ensure that all adults with unresectable pancreatic cancer receive PERT.¹³

Despite the clear evidence of the benefits, as well as relatively low risks and few contraindications of PERT, the therapy remains underused in pancreatic cancer management.³⁻⁵ In addition, the recent health care disruption, associated with the coronavirus disease 2019 (COVID-19) pandemic, was shown to affect both primary care prescribing¹⁴ and cancer care.¹⁵ For people with pancreatic cancer, PERT is usually initiated in hospitals, with primary care continuing the prescription after discharge. Therefore, by analyzing primary care prescribing, we capture changes in the relevant clinical practice. Patients are more likely to receive PERT if a clinical nurse specialist or a dietician is involved in their hospital care.¹⁶ However, more than 40% of patients do not receive a consultation with a dietician and more than 20% do not see a clinical nurse specialist before they are discharged.¹⁶ Given that PERT prescribing was suboptimal prior to COVID-19 and that rationing of pancreatic cancer diagnostics and treatment has been reported during the pandemic across the UK, there is a concern that this patient population would be further disadvantaged during the pandemic.

We therefore set out to undertake a national audit of PERT prescribing in primary care from January 2015 to January 2023 to evaluate the impact of the COVID-19 pandemic and to investigate the national and regional prescribing rates over time. Previous work in this area, such as the largest (until this study) national audit undertaken by the RICOCHET Study Group in 2018,¹⁶ relied on manual audits of patient records. This is a resource-intensive and limiting process (eg, duration and frequency of audits). The methodological advance of OpenSAFELY offers an improved monitoring approach. OpenSAFELY facilitates the opportunity for transparent and reproducible automated audits, which can be regularly updated with limited additional resources.

Methods

Study Design

We used a cohort study design to assess the proportion of adults with unresectable pancreatic cancer receiving PERT from January 1, 2015, to January 31, 2023. The national target was 100%, as per the NICE (2018) Quality Standard.¹³

Data Source

All data were linked, stored, and analyzed securely within the OpenSAFELY platform. Primary care records managed by the general practice (GP) software provider The Phoenix Partnership (TPP) were linked to Office of National Statistics (ONS) death data and to Secondary Uses Service (SUS) hospital procedures data through

OpenSAFELY, a data analytics platform created by our team on behalf of NHS England to address urgent COVID-19 research questions (opensafely.org). OpenSAFELY provides a secure software interface allowing the analysis of pseudonymized primary care patient records from England in near real-time within the electronic health record (her) vendor's highly secure data center, avoiding the need for large volumes of potentially disclosive pseudonymized patient data to be transferred off-site. This, in addition to other technical and organizational controls, minimizes any risk of re-identification. The dataset was based on 24 million people currently registered with GPs that use the TPP SystemOne software (covering >40% of England's population). It included pseudonymized data such as coded diagnoses, medications, and physiological parameters. It did not include free-text data.

Study Population and Study Measures

Between January 1, 2015, and January 31, 2023, each month we identified individuals receiving PERT (numerator) among adults with unresectable pancreatic cancer (denominator). PERT was defined using a list of medications compiled from the British National Formulary (BNF, bnf.org) and coded using NHS Dictionary of Medicines and Devices, the nationally mandated NHS terminology. Individuals were classified each month as receiving PERT if they had a prescription between the 1st day of that month and 61 days after. This was because 86% of prescriptions are issued for durations of 1 or 2 months.¹⁷ Date of pancreatic cancer diagnosis was defined as the first time that a clinical code for pancreatic cancer was entered in a primary care record. Adults with unresectable pancreatic cancer were defined by a presence of clinical codes for pancreatic cancer and an absence of OPCS-4 codes indicating a surgical resection procedure after pancreatic cancer diagnosis. The study flowchart explaining inclusion criteria is presented in Fig. 1.

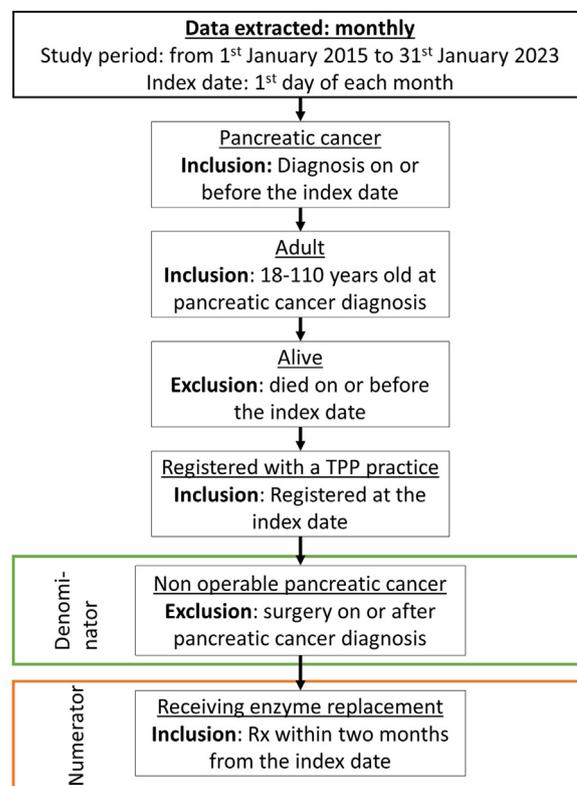


FIG. 1. Study flowchart explaining inclusion and exclusion criteria. Each month, the rate was calculated of people receiving pancreatic enzyme replacement therapy (numerator) among people with unresectable pancreatic cancer (denominator).

Statistical Methods

The overall trends in prescribing, and by regions in England, were visualized over time. Monthly rates were presented as the proportion of individuals receiving PERT per 100 people with unresectable pancreatic cancer (%). Using the interrupted time-series approach, generalized linear model (GLM) was fitted to the data to model the overall trend in prescribing over time and predict the expected rates in prescribing as if the pandemic had not occurred to model the effect of COVID-19. The time was included as a continuous variable to allow change in prescribing rates over time. The seasonality effect (month) was not accounted for. A variable that represented the COVID-19 period was included together with its time interaction term to allow varying slope. The 95% confidence intervals of the predicted values were used to estimate the significance of the difference between the predicted and observed values (to estimate the effect of the COVID-19 pandemic).

Software and Reproducibility

Data management was performed using Python 3.8 and analysis carried out using R 4.0.2. Software for data management and analysis is available online via github.com/opensafely/PaCa_Enzyme_Rx. Code lists are available via opencode.org.

Patient and Public Involvement

OpenSAFELY has developed a publicly available website <https://opensafely.org/> through which they invite any patient or member of the public to make contact regarding the broader OpenSAFELY project.

Results

Study Population

In the study period, there were 22,860 people diagnosed with pancreatic cancer in the dataset. On average, there were 263 (± 24

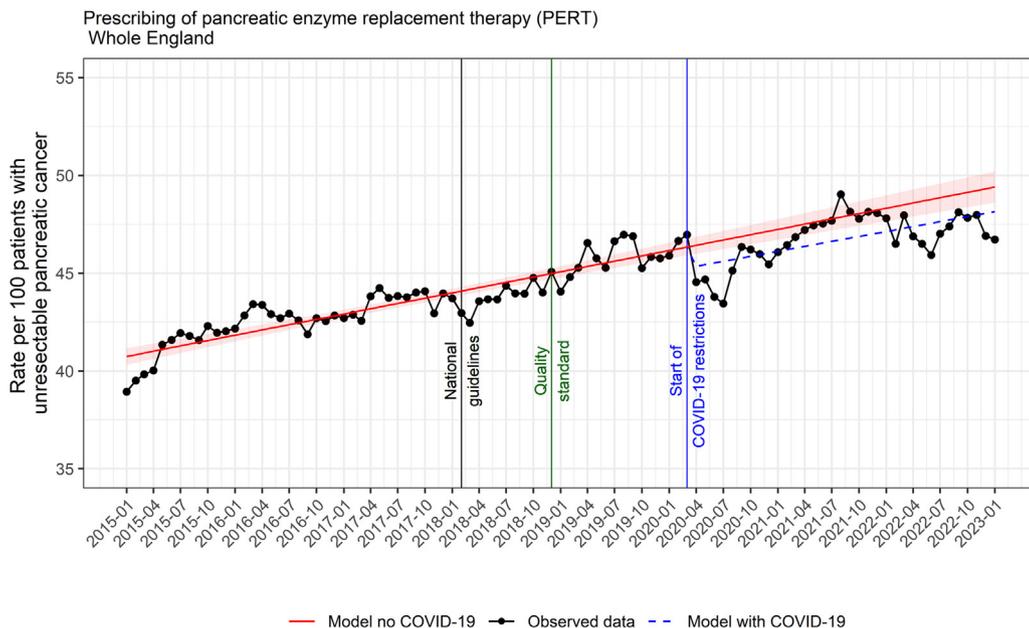
SD) pancreatic cancer diagnoses each month. As shown elsewhere, in this cohort of people, the COVID-19 pandemic did not affect the rates of pancreatic cancer diagnosis, but it negatively affected rates of surgical treatment.¹⁸ The mean age at pancreatic cancer diagnosis was 72 (± 11 SD) years, 48% of participants were females, and 95% of participants (for which ethnicity data were recorded) were of White ethnicity.

Effect of COVID-19

Fig. 2 shows the rates in prescribing over time in England. Although the average trends in the pandemic period are slightly lower than predicted, we concluded that, overall, the COVID-19 pandemic did not affect PERT prescribing to people with unresectable pancreatic cancer. A clear dip in treatment rates, by about 3% (from 46% to 43%), was observed immediately at the start of the pandemic (from March to July 2020). This dip could be associated with the effect of COVID-19. However, the dip was small and transient, and the rates of prescribing recovered by September 2020 to rates that would be expected if the pandemic had not occurred. In addition, although the average trends throughout the pandemic period were lower than predicted (by about 1%), and this was statistically significant, these trends cannot be directly interpreted as the effect of the pandemic.

National and Regional Trends

In view of the national target rate of 100%, the national trend increased gradually over time on average by 1% every year, ranging from 41% in 2015 to 48% by the end of 2022 (Fig. 2). Fig. 3 shows the rates in prescribing by regions in England. The highest rates, achieving values between 50% and 60% from 2018 onward were in the West Midlands region. The lowest rates of between 20% to 30% were in the London region. However, because London is underrepresented in the dataset,¹⁹ these findings need to be interpreted with caution. The effect of COVID-19 was the most pronounced in the West Midlands



OpenSafely-TPP March 2023

FIG. 2. National rates of prescribing of pancreatic enzyme replacement therapy to people with unresectable pancreatic cancer in England between January 1, 2015, and January 31, 2023. Vertical lines indicate points in time of interest to the study; black line, February 2018: publication of the National Institute for Health and Care Excellence (NICE) first UK national guidelines¹² recommending pancreatic enzyme replacement therapy to people with pancreatic cancer; green line, December 2018: publication of the NICE Quality Standard 4¹³ published to ensure that all adults with unresectable pancreatic cancer receive pancreatic enzyme supplementation; blue line, March 2020: start of the COVID-19–related national restrictions.

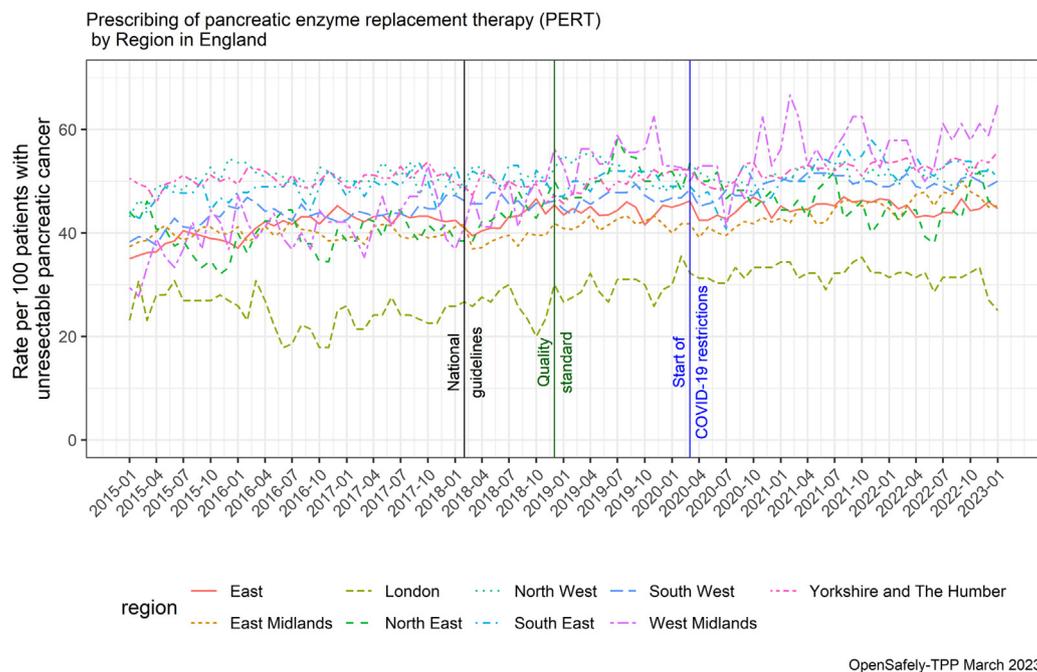


FIG. 3. Regional rates of prescribing of pancreatic enzyme replacement therapy to people with unresectable pancreatic cancer in England between January 1, 2015, and January 31, 2023. Note that the representativeness of the London region in the dataset is limited. Vertical lines indicate points in time of interest to the study; black line, February 2018: publication of the National Institute for Health and Care Excellence (NICE) first UK national guidelines¹² recommending pancreatic enzyme replacement therapy to people with pancreatic cancer; green line, December 2018: publication of the NICE Quality Standard 4¹³ published to ensure that all adults with unresectable pancreatic cancer receive pancreatic enzyme supplementation; blue line, March 2020: beginning of the COVID-19–related national restrictions.

region with a dip in rates by nearly 10% (from 50% to 40%) in July 2020. This recovered by September 2020 to levels higher than pre-pandemic.

Discussion

Overall, there was no change in prescribing of PERT to people with unresectable pancreatic cancer during the COVID-19 pandemic. Reassuringly, despite the challenges of the COVID-19 pandemic, clinicians ensured continuity of care in this area. We did observe a small and temporary decrease in prescribing rates from March to July 2020, which recovered fully by September 2020 to rates that would be expected if the pandemic had not happened. The delivery of cancer services was severely impacted by the COVID-19 pandemic. Effects on cancer surgery,^{20,21} chemotherapy,²² and cancer research²³ have been well described. In pancreatic cancer, centers have described impact on the entire pathway, including diagnostic, staging, and treatment delivery.²⁴ In contrast, in this study we show that prescribing of PERT to people with unresectable pancreatic cancer was not affected during the COVID-19 pandemic.

Importantly, with the target prescribing rate of 100% (all adults with unresectable pancreatic cancer are to be prescribed PERT),¹³ we found that despite the clear benefits, PERT remained underprescribed in this group of patients. In pancreatic cancer, PERT is usually initiated in hospitals, and primary care continues the prescription after discharge. The RICOCHET audit demonstrated that patients were more likely to receive PERT if clinical nurse specialists or dietitians were involved in patients' care and suggested that services should ensure patients have contact with these clinicians during their hospital care.¹⁶ Clinical nurse specialists have an important role in educating patients regarding the correct administration of PERT and continuation of PERT after discharge and should ensure dissemination of best practice to primary care.

A previous national UK study, undertaken between 2001 and 2015, demonstrated an overall prescribing rate of PERT to people with pancreatic cancer at 21%.³ A regional UK study observed a

prescribing rate of 22% between 2010 and 2012.⁴ More recently, the national RICOCHET audit conducted in April to August 2018, 6 months after the introduction of the national pancreatic cancer guidelines, demonstrated rates of 74% for patients with resectable disease and 45% for patients with unresectable disease.¹⁶ The current study demonstrated rates consistent with the RICOCHET audit. However, an important finding is that although increasing over time, at just under 50% in 2022, the rates were still below the recommended 100% quality standard.¹³

Strengths and Limitations

The key strength of this population-based study is the large size (40% of the population in England) and completeness of the underlying raw EHR data in OpenSAFELY.²⁵ In addition, because the OpenSAFELY platform provides analysis directly on the servers of the EHR administrator (TPP), we access near real-time data while prioritizing patient privacy (no need for data transfers). The national audit undertaken by the RICOCHET Study Group¹⁶ relied on manual audits of patient records by many local teams in the UK, following by compilation of the results centrally. In contrast, the automated audit method that we developed enables frequent and cost-effective re-execution of the analysis at regular audit cycles (<https://doi.org/10.53764/rpt.a0b1b51c7a>). In addition, because with OpenSAFELY we are able to access the full set of patients' records, we provided a longitudinal view of trends in prescribing since 2015. This allowed us to investigate the effect of the COVID-19 pandemic. All analytics software and code lists are shared openly and are available for inspection and re-use, providing opportunity for reproduction of this report to support recovery from the COVID-19 pandemic and reducing duplicative efforts.

We also note some limitations. We note that our data will only include prescriptions issued in primary care, but it is possible that some hospitals supply the medicines directly to patients when they attend the hospital. We have written extensively^{26,27} on the availability of hospital prescriptions, and NHS Digital recently made some of

this hospital medication data available for a small subset of hospitals.²⁸ We will seek to incorporate this in any future work. In addition to regional variation, more research is needed to investigate different groups of patients. The pandemic exacerbated health care inequalities, and future work is needed to investigate PERT prescribing in different sociodemographic groups. We also note that pancreatic cancer was defined by coding in primary care, rather than via linkage with cancer registry, the gold standard for cancer diagnoses.

Policy Implications and Future Research

Across the UK, pancreatic cancer care has been centralized since 2001, largely due to the need to reduce perioperative mortality. This, however, created a potential disconnect between specialist and non-specialist sites. Patients with unresectable pancreatic cancer are typically treated at their local hospital, which for most patients will not be a specialist site, and will receive regular repeat prescriptions from their general practitioner. The RICOCHET audit of pancreatic cancer and PERT prescribing demonstrated that rates of PERT prescribing were highest within specialist sites, regardless of tumor stage and treatment intent.¹⁶ RICOCHET also demonstrated that high prescribing rates were shared within hospitals (ie, if there was high prescribing in resectable cancer, there was high prescribing in unresectable cancer, and vice versa) but not across each local network, which consisted of the central specialist surgical unit and their referring nonspecialist sites (ie, prescribing rates in each specialist center did not correlate with those within each center's network of referring nonspecialist sites). The geographic variation observed in the present study contrasts with those data. Given that RICOCHET was a snapshot of a 3-month cohort of patients, the present study is much better placed to observe regional variation in practice. Understanding why regions have differing rates of prescribing could help overcome barriers to PERT prescribing. Additionally, qualitative research, beyond the scope of this study, is needed to understand barriers to the implementation of NICE guidelines and quality standards.

More broadly, the implications of this study for data use to improve NHS services are very substantial. Previously, practical and privacy challenges around accessing GP data meant that the largest study to date in this area, RICOCHET, relied on manual audits by many local teams at a single point in time. This manual approach imposes a substantial resource burden on local teams collecting data as well as being hard to reproduce on an ongoing basis. Using the OpenSAFELY framework, we were able to execute a single analysis in OpenSAFELY-TPP for 40% of the population in near real-time, while leaving the data in situ, preserving trust. OpenSAFELY was the single most trusted COVID-19 data project in a rigorous Citizen's Jury sponsored by the NHS and the National Data Guardian.²⁹ We can extend this analysis to OpenSAFELY-EMIS, increasing coverage to 99% of English GPs, as well as providing fine-grained demographic (eg, ethnicity) or clinical subpopulations. OpenSAFELY tools can facilitate cost-effective, ongoing, and near real-time audits and feedback to NHS organizations. This presents an important opportunity in the context of rapidly evolving pressures on the health service during the COVID-19 recovery period.

Conclusion

The COVID-19 pandemic did not affect PERT prescribing in unresectable pancreatic cancer. However, despite national guidelines, underprescribing of PERT continues and has improved only marginally since their publication. This could be an important missed opportunity to reduce morbidity for patients. The research into the effect of COVID-19 as well as barriers to prescribing of PERT and geographic variation is urgently needed to improve quality of care.

Declaration of Competing Interests

BG received research funding from the Laura and John Arnold Foundation, the NHS National Institute for Health Research (NIHR), the NIHR School of Primary Care Research, NHS England, the NIHR Oxford Biomedical Research Centre, the Mohn-Westlake Foundation, NIHR Applied Research Collaboration Oxford and Thames Valley, the Wellcome Trust, the Good Thinking Foundation, Health Data Research UK, the Health Foundation, the World Health Organisation, UKRI MRC, Asthma UK, the British Lung Foundation, and the Longitudinal Health and Wellbeing strand of the National Core Studies programme; he is a Non-Executive Director at NHS Digital; he also receives personal income from speaking and writing for lay audiences on the misuse of science. BMK is employed as a pharmacist by NHS England and seconded to the Bennett Institute.

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The views expressed are those of the authors and not necessarily those of the NIHR, NHS England, UK Health Security Agency (UKHSA), or the Department of Health and Social Care.

Funders had no role in the study design, collection, analysis, and interpretation of data; in the writing of the report; and in the decision to submit the article for publication.

Contributions

The OpenSAFELY Collaborative built the data infrastructure used in this study; AL, AM, AW and BMK contributed to the conception and planning of the study; AL, CA, LF, BBC, AW and BMK conducted the analysis; AL, CA, LF, KJR, BG, AW and BMK contributed to the interpretation of the results; AL, KJR and BMK written the first draft of the manuscript; all authors contributed to the subsequent revisions and approved the final version.

Information Governance and Ethical Approval

NHS England is the data controller for OpenSAFELY-TPP; TPP is the data processor; all study authors using OpenSAFELY have the approval of NHS England. This implementation of OpenSAFELY is

hosted within the TPP environment which is accredited to the ISO 27001 information security standard and is NHS IG Toolkit compliant.³⁰

Patient data have been pseudonymized for analysis and linkage using industry standard cryptographic hashing techniques; all pseudonymized datasets transmitted for linkage onto OpenSAFELY are encrypted; access to the platform is via a virtual private network (VPN) connection, restricted to a small group of researchers; the researchers hold contracts with NHS England and only access the platform to initiate database queries and statistical models; all database activity is logged; only aggregate statistical outputs leave the platform environment following best practice for anonymisation of results such as statistical disclosure control for low cell counts.³¹

The OpenSAFELY research platform adheres to the obligations of the UK General Data Protection Regulation (GDPR) and the Data Protection Act 2018. In March 2020, the Secretary of State for Health and Social Care used powers under the UK Health Service (Control of Patient Information) Regulations 2002 (COPI) to require organizations to process confidential patient information for the purposes of protecting public health, providing healthcare services to the public and monitoring and managing the COVID-19 outbreak and incidents of exposure; this sets aside the requirement for patient consent.³² This was extended in November 2022 for the NHS England OpenSAFELY COVID-19 research platform.³³ In some cases of data sharing, the common law duty of confidence is met using, for example, patient consent or support from the Health Research Authority Confidentiality Advisory Group.³⁴

Taken together, these provide the legal bases to link patient datasets on the OpenSAFELY platform. GP practices, from which the primary care data are obtained, are required to share relevant health information to support the public health response to the pandemic, and have been informed of the OpenSAFELY analytics platform.

The study was approved by the Health Research Authority (Research Ethics Committee reference 20/LO/0651) and the London School of Hygiene and Tropical Medicine (London, UK) Ethics Board (reference 21863).

Data Access and Verification

Access to the underlying identifiable and potentially re-identifiable pseudonymised electronic health record data is tightly governed by various legislative and regulatory frameworks and restricted by best practice. The data in OpenSAFELY are drawn from GP data across England where TPP is the data processor. TPP developers initiate an automated process to create pseudonymized records in the core OpenSAFELY database, which are copies of key structured data tables in the identifiable records. These pseudonymized records are linked onto key external data resources that have also been pseudonymized via SHA-512 one-way hashing of NHS numbers using a shared salt. Bennett Institute for Applied Data Science developers and PIs holding contracts with NHS England have access to the OpenSAFELY pseudonymized data tables as needed to develop the OpenSAFELY tools. These tools in turn enable researchers with OpenSAFELY data access agreements to write and execute code for data management and data analysis without direct access to the underlying raw pseudonymized patient data and to review the outputs of this code. All code for the full data management pipeline—from raw data to completed results for this analysis—and for the OpenSAFELY platform as a whole is available for review at github.com/OpenSAFELY. The data management and analysis code for this paper was led by AL and contributed to by CA.

Data Sharing

Detailed pseudonymized patient data are potentially re-identifiable and therefore not shared. The process for external users to

request access to data via the OpenSAFELY platform is described on opensafely.org.

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