

# Association between glycosylated haemoglobin and outcomes for patients discharged from hospital with diabetes: A health informatics approach

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## Abstract

**Aims/Objectives:** Extensive research considers associations between inpatient glycaemic control and outcomes during hospital admission; this cautions against overly tight glycaemic targets. Little research considers glycaemic control following hospital discharge. This is despite a clear understanding that people with diabetes are at increased risk of negative outcomes, following discharge. We evaluate absolute and relative HbA1c values, and frequency of HbA1c monitoring, on readmission and mortality rates for people discharged from hospital with diabetes.

**Methods:** All discharges ( $n = 46,357$ ) with diabetes from a major tertiary referral centre over 3 years were extracted, including biochemistry data. We conducted an evaluation of association between HbA1c, mortality and readmission, statistical significance and standardised Cohen's D effect size calculations.

**Results:** 399 patients had a HbA1c performed during their admission. 3,138 patients had a HbA1c within 1 year of discharge. Mean average HbA1c for readmissions was 57.82 vs 60.39 for not readmitted ( $p = 0.009$ , Cohen's D 0.28). Mean average number of days to HbA1c testing in readmitted was 97 vs 113 for those not readmitted ( $p = 0.00006$ , Cohen's D 0.39). Further evaluation of mortality outcomes, cohorts of T1DM and T2DM and association of relative change in HbA1c was performed.

**Conclusions:** Lower HbA1c values following discharge from hospital are significantly associated with increased risk of readmission, as is a shorter duration until testing. Similar patterns observed for mortality. Findings particularly prominent for T1DM. Further research needed to consider underlying causation and design of appropriate risk stratification models.

## Keywords

Diabetes, biochemistry, health informatics, hospital discharge, readmission

Submission date: 28 June 2020; Acceptance date: 13 March 2021

## Introduction

Diabetes represents a condition of impaired glycaemic control.<sup>1</sup> Therefore, one of the central features of diabetes care aims to return glycaemic control into a physiological range through diet, oral medications or injectable medications.<sup>2,3</sup> Glycaemic control is typically measured through either fingerpick blood sugar readings or glycosylated haemoglobin levels (HbA1c).<sup>4</sup> The glycosylated haemoglobin value (HbA1c) reports the amount of glucose bound to haemoglobin molecules,

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and represents an average of blood sugar control over the preceding 6 weeks prior to the test being taken.<sup>4</sup>

There are not “normal values” for HbA1c as such, however the HbA1c value can be used in both the diagnosis of T2DM and monitoring of all types diabetes (although less useful in monitoring gestational diabetes mellitus – GDM. When monitoring control of diabetes, using HbA1c, it is typically the change in HbA1c value over time that is most useful rather than an individual HbA1c value. NICE generally recommend an HbA1c level target of 48 mmol/mol in treatment of T2DM. However, they stress that this target must be personalised and should be relaxed to 53 mmol/mol, where there is a risk of hypoglycaemia.

There is good evidence that maintaining glycaemic levels within physiological levels can reduce or minimise the risk of diabetic complications, in the long term (months-years), both for patients with type 1 diabetes and type 2 diabetes.<sup>5,6</sup> Shorter term blood sugar control can also have a significant impact on health outcomes, with significantly higher or lower readings resulting in significant morbidity, mortality and health-care utilisation.

Managing glycaemic control in the context of intercurrent illness and diabetes is, a relatively complex process. In particular, there has been significant research considering the optimal glycaemic control for patients who are inpatients within hospital settings. There is a need to balance the risks of overly tight glycaemic control that risks hypoglycaemia versus the risks of thrombosis, diabetic ketoacidosis and hyperosmolar hyperglycaemic state that can occur with higher blood sugar values. It has been identified that glycaemic control can impact on both survival and length of stay for people with diabetes admitted to hospital.<sup>7</sup> Hyperglycaemia has clearly been associated with adverse patient outcomes across a number of studies.<sup>8,9</sup> However, interventions that have aimed to correct blood sugars into normal ranges have either not improved outcomes<sup>10,11</sup> or in certain circumstances have led to worsening outcomes.<sup>11</sup> Randomised controlled trials have suggested that hypoglycaemia is the primary driver of worsening patient outcomes associated with overly intense inpatient blood sugar control.<sup>12</sup> Therefore, the overall consensus and guideline driven position for inpatient glycaemic control is that in general inpatient populations, a moderate, rather than overly tight control is advisable to optimise patient outcomes, including length of stay and readmission risk.<sup>13</sup>

However, when considering the impact of glycaemic control on the discharge process from hospital, and associated risks of readmission or mortality there has been much less research. Four articles consider the impact of glycaemic control in general on readmission;

one of which focuses on the importance of the “most extreme blood sugar value” during inpatient admission and the second article considers the impact of glycaemic variability. These articles, therefore, considered relatively specific markers of inpatient glycaemic control and both were restricted to specific subsets of hospital inpatients with diabetes.<sup>14–17</sup> The Diabetes Early Re-admission Risk Indicator (DERRI) is an externally validated and important tool that aims to predict all cause readmission within 30 days for patients discharged from hospital with diabetes, and found HbA1c to be significantly associated with readmission,<sup>18</sup> the paper however notes that adding HbA1c to DERRI did not increase the accuracy of the model.

Importantly, however, there has been considerably more research looking at the impact of inpatient hypoglycaemia on readmission patterns for patients discharged from hospital with diabetes.<sup>19–23</sup> These studies all considered generalised populations of people with diabetes admitted to hospital, rather than specific subsets of patients. It is likely that this focus on hypoglycaemia and readmission patterns is driven by an awareness of hypoglycaemia as a major driver of hospital admission and, therefore, cost in diabetes management. Remarkably, there is even less research considering the impact of glycaemic control on mortality outcomes following hospital discharge.

This paper looks to perform the first evaluation of the impact of glycaemic control on discharge outcomes of mortality and readmission, when patients with diabetes are discharged from hospital. It focuses on both the value of glycosylated haemoglobin and the frequency of monitoring. The use of HbA1c is selected due to its ready availability in electronic health record systems. As such it facilitates an informatics-based approach both in this research, but also when considering wider dissemination and adoption of this work in other settings.

## Methods

The study adopted a retrospective evaluation of data extracted from the electronic health record (EHR) of a large tertiary referral centre, in the West Midlands region of the United Kingdom, for all patients discharged from University Hospitals Coventry and Warwickshire NHS Trust with a diagnosis of diabetes, over a 3-year period. Only adult patients with Type 1 or Type 2 diabetes were included. Patients with GDM were excluded from the study. This is because HbA1c values vary significantly during pregnancy, with no clear normal ranges established.<sup>24</sup> Indeed, the National Institute of Health & Clinical Excellence do not recommend HbA1c measurement during pregnancy.<sup>25</sup>

All HbA1c values for patients in the region (including those performed in the community setting) are analysed at the hospital laboratory and included within the electronic health record. HbA1c values were extracted for all patients discharged with diabetes as above. Patients from outside the region may have had HbA1c values calculated at other hospital laboratories and whose readings would not appear on University Hospital Coventry & Warwickshire NHS Trusts Electronic Health Record. Therefore, patients, who had postcode sectors outside of the Coventry & Warwickshire region, were also excluded from the study. Extraction of data was supported by a Biochemistry Performance and Programme Management Office Analyst.

The outcomes of interest were readmission within 30 days and mortality within 365 days. Multiple discharges were included per patient if they were admitted more than once. The association between HbA1c absolute values and frequency of HbA1c monitoring was analysed using Student's T-Test, following adequate assessment for skew and kurtosis to ensure normality. An absolute skew value larger than 2 or an absolute kurtosis (proper) larger than 7 may be used as reference value for determining substantial non-normality. A p-value of  $<0.05$  was considered significant. Standardised size was evaluated using Cohen's D for pre-specified patient cohorts of patients with Type 1 Diabetes and Patients with Type 2 diabetes.

Ethical approval was granted by the local NHS Trust Research Ethics Committee, at University

Hospitals Coventry & Warwickshire NHS Trust through the Governance arrangements for Research Ethics Committee Process [Study Ref: GF0220]. Approval was also granted through the University of Warwick's Biomedical & Scientific Research Ethics Committee [Study Ref: REGO-2017-2114].

All statistical testing was performed using Microsoft Excel 2016<sup>26</sup> and IBM's SPSS v24.<sup>27</sup>

## Results

### *HbA1c during admission*

There were 399 patients meeting the inclusion criteria described above, who had a HbA1c sample analysed and recorded in the electronic health record system, during their hospital admission prior to discharge. 52 of these patients were readmitted within 30 days and 63 died within 365 days. The mean average HbA1c value of this cohort overall was 73 mmol/mol.

### *HbA1c during admission – Readmission (Table 1)*

The mean average HbA1c, during admission for patients, who were not readmitted within 30 days, was 74.6 mmol/mol, compared to 65.6 mmol/mol for patients readmitted within 30 days of discharge ( $p = 0.006$ , Cohen's D 0.33).

### *HbA1c during admission – Mortality (Table 2)*

The mean average HbA1c, assessed during admission for patients who survived 365 days, was 69.05 mmol/mol

**Table 1.** Association of HbA1c during admission with readmission (generalised population of patients with diabetes).

Average HbA1c during admission	n	Av HbA1c (mmol/mol)	Skew	Kurtosis
Not readmitted within 30 days	309	74.58	1.10	1.29
Readmitted within 30 days	52	65.62	1.78	3.98
P-value	0.0058			
Cohen's D	0.33			

**Table 2.** Association of HbA1c during admission with mortality (generalised population of patients with diabetes).

Average HbA1c during admission	n	Av HbA1c (mmol/mol)	Skew	Kurtosis
No death within 365 days	305	69.05	0.99	0.75
Died within 365 days	56	64.11	2.19	6.37
P-value	0.10			
Cohen's D	0.21			

and the mean average HbA1c, for patients who died within 365 days, was 64.11 mmol/mol. ( $p=0.1$ , Cohen's D N/A).

### HbA1c post discharge

For patients, who had an HbA1c assessed within a year of hospital discharge, the mean average HbA1c was 59.9 mmol/mol, with an average time until HbA1c assessment of 110 days.

### HbA1c post discharge readmission

When considering absolute HbA1c values and readmission for generalised populations of patients with diabetes ( $n=3,403$ ), the average HbA1c value of those not readmitted to hospital within 30 days was 60.4 mmol/mol, whereas the average HbA1c of those readmitted to hospital was 57.8 mmol/mol ( $p=0.008$ , Cohen's D 0.28) (Table 3).

The average number of days to HbA1c testing, for those discharged from hospital and not readmitted, was 115.23, whereas the average number of days until testing for those discharged and then readmitted was 83.05 days. ( $p<0.001$ , Cohen's D 0.39) (Table 4).

For patients with type 1 diabetes, the average HbA1c for those not readmitted was 74.4 mmol/mol, whereas the average HbA1c for those readmitted was 63.6 mmol/mol ( $p=0.0077$ , Cohen's D 0.44) (Table 5).

The average number of days, between hospital discharge and the HbA1c being tested, was 109.4 for those readmitted and 114.9 for those not readmitted ( $p=0.72$ , Cohen's D N/A) (Table 6).

For patients with type 2 diabetes, the average HbA1c for those not readmitted was 58.8 mmol/mol, whereas the average HbA1c for those readmitted was 57.5 mmol/mol ( $p=0.19$ , Cohen's D N/A) (Table 7).

The average number of days, between discharge and HbA1c being tested for those not readmitted, was

**Table 3.** Association of HbA1c post-discharge with readmission (generalised population of patients with diabetes).

Average HbA1c post-discharge (All)	n	Av HbA1c (mmol/mol)	Skew	Kurtosis
Not readmitted within 30 days	2618	60.39	1.50	3.60
Readmitted within 30 days	520	57.82	1.75	4.15
P-value	0.0088			
Cohen's D	0.28			

**Table 4.** Association between readmission and time to testing HbA1c (generalised population of people with diabetes).

Average time to hba1c post-discharge (All)	N	Average No. of days	Skew	Kurtosis
No. of days to test, no readmission within 30d	2618	115.23	0.80	-0.18
No. of days test , readmission within 30d	520	83.05	1.01	0.34
P-value	0.00006			
Cohen's D	0.39			

**Table 5.** Association of HbA1c post-discharge with readmission (T1DM population).

Average HbA1c post-discharge (T1DM)	n	Av HbA1c (mmol/mol)	Skew	Kurtosis
Not readmitted within 30 days	281	74.37	1.39	4.13
Readmitted within 30 days	42	63.64	0.86	0.35
P-value	0.0077			
Cohen's D	0.44			

**Table 6.** Association between readmission and time to testing Hba1c (T1DM).

Average time to hba1c post-discharge (T1DM)	N	Average No. of days	Skew	Kurtosis
No. of days to test, no readmission within 30d	281	109.46	0.89	-0.21
No. of days to test, readmission within 30d	42	114.86	0.76	-0.54
P-value	0.72			
Cohen's D	N/A			

**Table 7.** Association of Hba1c post-discharge with readmission (T2DM population).

Average Hba1c post-discharge (T2DM)	n	Av Hba1c (mmol/mol)	Skew	Kurtosis
Not readmitted within 30 days	2246	58.83	1.45	2.59
Readmitted within 30 days	459	57.50	1.88	4.95
P-value	0.19			
Cohen's D	N/A			

**Table 8.** Association between readmission and time to testing Hba1c (T2DM).

Average time to hba1c post-discharge (T2DM)	n	No. of days	Skew	Kurtosis
No. of days to test, no readmission within 30d	2246	113.50	0.80	-0.23
No. of days to test, readmission within 30d	459	95.23	1.05	0.50
P-value	0.00002			
Cohen's D	0.33			

**Table 9.** Association of Hba1c post-discharge with mortality (generalised population of patients with diabetes).

Average Hba1c post-discharge (All)	n	Av Hba1c (mmol/mol)	Skew	Kurtosis
No death within 365 days	2924	60.206	1.54	3.57
Died within 365 days	214	56.73	1.28	1.97
P-value	0.0074			
Cohen's D	0.18			

113.5 days, compared to 95.2 days for those readmitted ( $p < 0.001$ , Cohen's D 0.33) (Table 8).

### *Hba1c post discharge mortality*

The average Hba1c for the generalised population of patients with diabetes, who were discharged and

survived for over one year, was 60.2 mmol/mol, whereas the average Hba1c for those with mortality within 1 year was 56.7 mmol/mol ( $p = 0.007$ , Cohen's D 0.18) (Table 9).

The mean average time to Hba1c testing, for those who survived over a year, was 112 days, whereas the mean average time to testing, for those with mortality

within 1 year, was 83 days ( $p < 0.001$ , Cohen's D 0.37) (Table 10).

For patients with type 1 diabetes, the average HbA1c for those who survived to 365 days, post discharge, was 73.2 mmol/mol, whereas the average HbA1c for those readmitted was 59.4 mmol/mol ( $p < 0.001$ , Cohen's D 0.78) (Table 11).

The average number of days, between hospital discharge and the HbA1c being tested, was 110.8 for those readmitted and 98.5 for those not readmitted ( $p = 0.59$ , Cohen's D N/A) (Table 12).

For patients with type 2 diabetes, the average HbA1c, for those who survived 365 days post discharge, was 58.3, whereas the average HbA1c for those who died within 365 days was 54.2 ( $p = 0.07$ , Cohen's D N/A) (Table 13).

The average number of days between discharge and HbA1c being tested, for those not readmitted, was 113.5 days, compared to 96.119 days for those readmitted ( $p < 0.001$ ) Cohen's D 0.21) (Table 14).

## Discussion

The measurement of HbA1c, in patients with diabetes, has been a mainstay of monitoring disease and the long-term future risk of microvascular and microvascular risk since the Diabetes Control and Complications Trial (DCCT) and UK Prospective Diabetes Study: clinical and therapeutic implications for type 2 diabetes (UKPDS) published their results.<sup>5,28</sup> In both these studies, increased HbA1c values are associated with higher levels of adverse outcomes within the

**Table 10.** Association between mortality and time to testing HbA1c (generalised population of people with diabetes).

Average time to hba1c post-discharge	n	No. of days	Skew	Kurtosis
No. of days to test, survived 365 days	2924	112.19	0.81	-0.21
No. of days to test, died within 365 days	214	83.33	1.17	0.93
P-value	<0.0001			
Cohen's D	0.36			

**Table 11.** Association of HbA1c post-discharge with mortality (T1DM population).

Average Hba1c post-discharge (T1DM)	n	Av Hba1c (mmol/mol)	Skew	Kurtosis
No death within 365 days	308	73.20	1.27	3.58
Died within 365 days	15	59.41	-0.26	-1.57
P-value	0.00023			
Cohen's D	0.78			

**Table 12.** Association between mortality and time to testing HbA1c (T1DM).

Average time to hba1c post-discharge (T1DM)	n	No. of days	Skew	Kurtosis
No. of days to test, survived 365 days	308	110.89	0.87	-0.26
No. of days to test, died within 365 days	15	98.47	0.73	-0.70
P-value	0.59			
Cohen's D	N/A			

**Table 13.** Association of Hba1c post-discharge with mortality (T2DM population).

Average Hba1c post-discharge (T2DM)	n	Av Hba1c (mmol/mol)	Skew	Kurtosis
No death within 365 days	2513	58.30	1.54	3.08
Died within 365 days	192	54.18	1.31	2.01
P-value	0.07			
Cohen's D	N/A			

**Table 14.** Association between mortality and time to testing Hba1c (T2DM).

Average time to hba1c post-discharge (T2DM)	n	No. of days	Skew	Kurtosis
No. of days to test, survived 365 days	2513	113.53	0.80	-0.18
No. of days to test, died within 365 days	192	96.1	1.01	0.34
P-value	<0.0001			
Cohen's D	0.21			

patient populations. The research, reported in this paper, represents the first evaluation of the association, between glycaemic control on discharge outcomes of mortality and readmission, when patients with diabetes are discharged from hospital.

The results demonstrated no statistically significant associations between the Hba1c values, recorded during the inpatient stay, for both readmission and mortality outcomes. It is important to note that the population size was relatively small (361 patients) for each and may, thus, contribute towards the results not reaching significance. This small population size is notable, in that it potentially reflects a large proportion of patients with diabetes attending hospital but not having their Hba1c assessed during the admission period. This does not necessarily mean that clinical teams were not conscious of the Hba1c measure, when seeing these patients, but they may have considered the most recent Hba1c previously collected in the community setting. Additionally, the Hba1c values typically take, the laboratory at UHCW, 24 hours to process, therefore this delay may mean clinical teams feel there is less need to request an Hba1c value, for short admission patients.

However, statistically significant associations were noted in relation to Hba1c values following discharge from hospital. The Hba1c value is statistically significantly associated with 30-day readmission and 365-day mortality, in generalised populations of patients with diabetes. The Hba1c is statistically significantly associated with readmission and mortality for T1DM cohorts

but this was not seen for T2DM cohorts. Importantly, for both the generalised population of patients with diabetes and the T1DM cohorts, it was a higher Hba1c that was associated with lower rates of mortality and readmission. This may seem counterintuitive; however, similar patterns were seen in inpatient studies, based on finger-prick based glucose readings. In these studies, higher blood sugar readings were protective.<sup>29</sup> This was explained by the high risks of negative outcomes associated with hypoglycaemia, resulting from overly tight glycaemic control. It is likely that similar patterns may be being observed here, with hypoglycaemia already known to be a major driver of hospital readmission<sup>30</sup> and mortality.<sup>31</sup> It is possible that T2DM patients, who are on insulin or gliclazide, and T1DM (who are all on insulin) are the drivers of the results observed here, for both the generalised population of patients with diabetes and T1DM cohort. The high number of T2DM patients, who are not on hypoglycaemia inducing medications, may explain the lack of significance in this subpopulation. The medications patients are on is not extractable from the electronic patient record system used at UHCW NHS Trust and the source of data for this study. However, this is potentially an important observation and focus of future work, UHCW is in the process of procuring a new EHR system that includes electronic prescribing components and would facilitate future further work in this area.

The time, between discharge and the next testing of Hba1c values, was statistically significantly associated

with both readmission and mortality, for generalised populations of patients with diabetes. The time, between discharge and testing, was not significantly associated with mortality or readmission for patients with T1DM; however, it was significantly associated with patients with T2DM. The pattern for the generalised diabetes cohort and T2DM cohort follows what would be anticipated, with negative outcomes associated with a shorter period to HbA1c measurement. This likely represents more frequent contact with medical team for patients with diabetes, who are more likely to experience negative outcomes, and these medical teams requesting HbA1c more frequently. The lack of statistically significant association for patients with T1DM may be explained either by the smaller sample size, or perhaps, more likely, by the more frequent contact these populations have with medical teams as a routine part of their care, regardless of their underlying risks. Indeed, nearly all T1DM are seen in secondary care hospital clinics, as opposed to T2DM cohorts who are managed in the community and, although meant to have an at least annual nurse review with HbA1c, they have significantly less contact with medical teams.

This study has a number of limitations. There is the potential for missing values and missing data. The number of HbA1c tests, performed during the inpatient admission period, is perhaps lower than expected. However, the extraction process was supported by a Biochemistry Analyst at a University Tertiary Centre and, therefore, likely reflects a full and complete dataset, as contained within the clinical system. Any informatics-based study risks issues with data availability and missing values and it would be important to repeat this study at other centres, in order to look for differences in the outcomes generated. The analysis of HbA1c values obtained within 1 year post discharge in relation to readmission at 30 days may include a substantial proportion of HbA1c values that were obtained after the readmission and are therefore not suited to developing risk prediction models, but do provide important information regarding the relationship between HbA1c and patient readmission risk. We did not consider HbA1c values recorded in the time period prior to admission to hospital, this could represent important future work, not only would it allow for increased sample sizes if this work was to be completed at a multicentre setting, but it would also enable early identification of patients at risk of readmission. For example, if the HbA1c value within the 3 months prior to admission was indeed a risk factor for readmission, active interventions could be planned throughout the admission period to reduce future risk.

Secondly, HbA1c values themselves can, to some extent be unreliable, primarily influenced by factors affecting the lifespan of a patient's erythrocytes.<sup>32</sup>

Whilst, for the vast majority of patients being discharged from hospital, they are likely to represent a good marker of recent glycaemic control, in some circumstances, they can be misleading. Reasons for non-representative HbA1c values can include; blood transfusions,<sup>33</sup> pregnancy,<sup>24</sup> sickle cell disease,<sup>34</sup> medications<sup>35</sup> and dialysis.<sup>36</sup> The most important of these perhaps being the impact of blood transfusions in patients discharged following surgery, trauma or gastrointestinal bleeding where large volumes of blood may have been transfused.

This informatics work is exploratory in nature. It is important to note that we have not adjusted for multiple observations (through processes such as generalized estimating equations), therefore there is a possibility that associations could be overestimated. Despite the exploratory nature of the work, it is nevertheless important in demonstrating that biochemistry data may have an important role in understanding risk for patients with diabetes. This is also highly relevant, as new technologies may allow earlier identification of patterns that have been suggested by the HbA1c results collected here. HbA1c retrospectively looks at glucose patterns over the previous 6-week period, acting as an average effect rather than simple "point-in-time" blood sugar readings, which are entirely dependent on when the blood sugar reading is actually performed (in hospital for example the majority of fingerpick testing may be done around acute decompensations or surgical interventions, during the inpatient procedure, thus giving a non-representative summary of the overall blood sugar profile). We are however now able to gain a better understanding of average blood sugar readings through continuous blood sugar monitoring systems (CGM)<sup>37</sup> or interstitial fluid blood sugar monitoring systems, such as the Freestyle Libre.<sup>38</sup> Data from these systems are not widely available, in relation to inpatient care and the immediate post discharge period. However, the research presented here suggests that such information may be of significant importance in better understanding the risks, when patients with diabetes are discharged from hospital.

Finally, this work stresses that the hospital discharge process is a continuum, not just a point in time, with HbA1c values stretching across that continuum. This is a particularly important observation and something that clinicians often forget.

## Conclusion

Glycaemic control is currently the main indicator of effective diabetes management; typically, this is assessed through HbA1c values. This paper creates new knowledge in demonstrating the association between glycaemic control in the post discharge



period and negative outcomes of readmission and mortality both for generalised and specific subpopulations of diabetes. Importantly, this research extends current understanding from glycaemic control in the inpatient setting, where low HbA<sub>1c</sub> values may be associated with worse outcomes following hospital discharge, particularly for cohorts of patients with T1DM. This research represents an exploratory informatics-based work, identifying the need for further research to characterise the “peri-discharge” period from a glycaemic perspective. Newer technologies may enable a more detailed understanding of how glycaemic control varies, around the time of hospital discharge, and its subsequent influence on patient outcomes and thus could form the foundation of important future high-impact research.

### Availability of data and materials

Data was generated from the inpatient electronic health record patient-data of University Hospitals Coventry & Warwickshire NHS Foundation Trust. As is typical for data sets of this nature, whilst the information is anonymised, the ethical approval process requires analysis and storage of the raw data on secure NHS equipment due to the risk of inadvertent or indirect breaches to anonymization. The raw data may potentially be available from University Hospitals Coventry & Warwickshire NHS Trust subject to approval, ethical review and secure storage arrangements.

**Contributorship:** All authors have contributed significantly to the concept or design of the work; or acquisition, analysis or interpretation of data and been involved in drafting/revision including all authors approving the article for submission.

**Declaration of conflicting interests:** The author(s) declared no potential conflicts of interest with respect to the research, authorship, and/or publication of this article.

**Ethical approval:** Ethical approval was granted by the local NHS Trust Research Ethics Committee, at University Hospitals Coventry & Warwickshire NHS Trust through the Governance arrangements for Research Ethics Committee Process [Study Ref: GF0220]. Approval was also granted through the University of Warwick’s Biomedical & Scientific Research Ethics Committee [Study Ref: REGO-2017-2114].

**Funding:** The author(s) disclosed receipt of the following financial support for the research, authorship, and/or publication of this article: Tim Robbins receives funding through a PhD Studentship at WMG, University of Warwick. Theodoros N Arvanitis is partially funded by HDR UK. HDR UK is funded by the UK Medical Research Council, Engineering and Physical Sciences Research Council,

Economic and Social Research Council, Department of Health and Social Care (England), Chief Scientist Office of the Scottish Government Health and Social Care Directorates, Health and Social Care Research and Development Division (Welsh Government), Public Health Agency (Northern Ireland), British Heart Foundation and Wellcome Trust. Funder: HDR UK – Medical Research Council – Award Reference HDR-3001.

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