- 1 A retrospective review of medication-related incidents at a major teaching hospital and 2 the potential mitigation of these incidents with electronic prescribing and medicines 3 administration 4 5 Millie Cattell^{1*}, Kira Hyde^{1*}, Brian Bell^{2**}, Thomas Dawson³, Tim Hills³, Barbara Iyen², 6 Adam Khimji⁴, Anthony J Avery² 7 8 Affiliations 9 1. School of Medicine, University of Nottingham 2. Centre for Academic Primary Care, School of Medicine, University of Nottingham 10 11 3. Pharmacy Department, Nottingham University Hospitals NHS Trust 12 4. Birmingham Community Healthcare NHS Foundation Trust *joint first author 13 14 **corresponding author: 15 Brian Bell brian.bell@nottingham.ac.uk 16 17 Applied Health Research Unit 18 University Park 19 Nottingham 20 NG7 2RD 21 UK 22 23 Keywords: medical informatics, medication incidents, patient harm 24 25 Short title: 26 Medication-related incidents and electronic prescribing and medicines administration
- 27 Word count: 3000

28 Abstract

29 **Objectives:** To describe the frequency of the different types of medication-related 30 incidents that caused patient harm, or adverse consequences, in a major teaching 31 hospital and investigate whether the likelihood of these incidents occurring would have 32 been reduced by electronic prescribing and medicines administration (EPMA). 33 Methods: A retrospective review of harmful incidents (n=387) was completed for medication-related reports at the hospital between 1 September 2020 and 31 August 34 35 2021. Frequencies of different types of incidents were collated. The potential for EPMA to 36 have prevented these incidents was assessed by reviewing DATIX reports and additional 37 information, including results of any investigations. 38 Results: The largest proportion of harmful medication incidents were administration 39 related (n=215, 55.6%), followed by incidents classified as 'other' and 'prescribing'. Most 40 incidents were classified as low harm (n = 321, 83.0%). EPMA could have reduced the 41 likelihood of all incidents which caused harm by 18.6% (n=72) without configuration, 42 and a further 7.5% (n=29) with configuration where configuration refers to adapting the 43 software's functionality without supplier input or development. For 18.4% of the low-44 harm incidents (n=59) and 20.3% (n=13) of the moderate-harm incidents, EPMA could 45 reduce the likelihood of the incident occurring without configuration. Medication errors 46 most likely to be reduced by EPMA were due to illegibility, multiple drug charts or

47 missing drug charts.

Conclusion: This study found that administration incidents were the most common type of medication-related incidents. Most of the incidents (n = 243, 62.8%) could not be mitigated by EPMA in any circumstance, even with connectivity between technologies. EPMA has the potential to prevent certain types of harmful medication-related incidents, and further improvements could be achieved with configuration and development.

- 54
- 55
- 56

57 Key Messages

58 What is already known on this topic:

59 One intervention shown to reduce medication errors is 'Electronic prescribing and

60 medicines administration' (EPMA) systems.

61 What this study adds:

- 62 This study found that administration incidents were the most common type of
- 63 medication-related incidents, most of the incidents were classified as low harm. More
- 64 than half of the incidents could not be mitigated by any EPMA system even with further
- 65 development, but EPMA could reduce the likelihood of a small number of low-harm and
- 66 moderate-harm incidents.

67 How this study might affect research, practice, or policy:

- 68 EPMA could lead to a reduction of harmful incidents in hospitals, and further
- 69 improvements can be achieved with targeted configuration and development.
- 70 Recommendations provided by this study can be used by hospitals to target their

71 optimisation of EPMA.

- 72
- 73

75 **Introduction**

76 Medicines are an integral part of healthcare but there is growing evidence of the 77 importance of medicines safety and the need to prevent medication errors to improve 78 patient safety. Medication related adverse events can be the result of people either 79 experiencing adverse drug reactions (not usually preventable) or as a result of 80 medication errors (usually preventable) [1,2]. Medication errors, which are commonly 81 understood as errors throughout the process of prescribing, dispensing, administering or 82 monitoring medicines, irrespective of whether this caused harm to a patient or not [3], 83 occur frequently. Although medication error classification may differ between 84 organisations, the principles of error reduction and clinical risk management still apply to 85 the underlying risks [4].

86

The data collected by the National Reporting and Learning System in England indicates that medicines cause around 9% of total reported incidents in the NHS [5]. Across England it's estimated that 237 million medication errors occur each year, with 66 million having the potential to be clinically significant [6]. Current literature shows that around half of adverse drug events (ADEs) are preventable in the secondary care setting [7,8]. Given the consequences of ADEs there is a significant need for preventative strategies that systemically target medication errors to improve patient safety and reduce costs.

95 EPMA can be defined as the use of electronic systems to facilitate the communication of 96 a prescription or medicine order to aid the choice, administration, and supply of a 97 medicine. Electronic prescribing and medicines administration (EPMA) systems can 98 overcome certain drawbacks of paper-based prescribing and has been shown to reduce 99 medication errors. EPMA can eliminate errors due to poor handwriting and illegibility, a 100 particular problem for paper-based prescribing [9] and can also reduce problems due to 101 data loss. EPMA ensures legibility and completeness of a prescription and most systems 102 have in-built clinical decision support functionalities that provide decision support for 103 clinicians with recommended doses, routes and frequencies [10] to decrease the

likelihood of the clinician writing an incorrect prescription. Kwan [11] found that the use
of clinical decision support systems increased the percentage of patients received the
desired level of care by 5.8%.

107

108 At the time of the study, Nottingham University Hospitals (NUH) NHS Trust, a large 109 teaching Hospital in the East Midlands, relied solely on a paper-based system, except for 110 cancer patients receiving care via Chemocare (https://www.cis-healthcare.com/). The 111 Trust acquired funding to implement a next generation EPMA system called Nervecentre 112 (NerveCentre Software, Wokingham, UK) as the first part of a fully integrated electronic 113 patient record. Nervecentre has a range of clinical decision support and safety features 114 including the ability to build dose sentences, automatic interaction and allergy checking, 115 and barcode scanning for positive patient and medication identification

116 (https://nervecentresoftware.com/next-gen-epr-3/epma/).

117

118 This study investigated the different types of medication-related incidents at NUH from a 119 non-anonymous incident reporting system (DATIX [12], to 1) describe the frequency of 120 the different types of medication-related incidents that caused patient harm; 2) identify 121 and classify whether the likelihood of these incidents occurring, and associated risk could 122 have been reduced by EPMA, including clinical decision support. This research is 123 important because it identifies a novel way of determining what impact the EPMA system 124 could have on existing safety issues at the point of system selection and identifies 125 significant areas or themes relating to medication safety that cannot be solely addressed 126 by the implementation of an EPMA system.

127

128 Methods

129 Study Design

130 The study was a retrospective review of 3988 medication-related reports recorded by131 healthcare professionals at Nottingham University Hospitals NHS Trust through the

DATIX incident-reporting system. This reporting system provided the framework for classifying incidents in line with the requirements of the English National Reporting and Learning System (NRLS) [13]. The reports represent the records of inpatients at the hospital between 1st September 2020 and 31st August 2021. The study was approved by the Clinical Effectiveness Department at the Trust and ethical committee approval was not required.

138

139 Data Sources/Measurement

Data from DATIX included only medication-related incidents that were submitted and
classified by the reporter as medication related. Repeat entries were excluded and data
were anonymised. The incidents were classified into categories by the healthcare
professional that reported the incident. The DATIX categories refer to the stage in the
medication process where the incident occurred; these categories included:
Administration, Discharge, Pharmacy, Prescribing and there is also a category for Other
incidents. The incidents were then further categorised into more specific subcategories

147 (see Supplementary File 1).

148

The data extracted from each DATIX entry included the degree of harm to the patient, and category and subcategory of the type of incident. The degree of harm was selected by the healthcare professional reporting the incident and (except for no-harm incidents) was confirmed or updated by a second person (an incident investigator within the Trust). Staff are expected to assess harm in accordance with the incident reporting policy at the Trust [14]. The policy defines each degree of harm and gives a non-exhaustive list of examples.

156 The levels of harm were:

- None: any unexpected or unintended event that resulted in no harm and no
 additional treatment being required.
- 159 2. Low: any unexpected or unintended event that required extra observation or160 minor treatment and caused minimal harm.

- 161 3. Moderate: any unexpected or unintended event that required further additional
 162 treatment or an intervention of some kind and caused temporary or short-term
 163 harm.
- 164 4. Severe: any unexpected or unintended event that caused permanent or long-165 term harm.
- 166 5. Catastrophic (Death): any unexpected or unintended event that may have caused167 death.
- 168
- 169 Selection of Records
- 170 Prior to the in-depth review of the data, any medication-related incidents identified in
- 171 the outpatient setting were excluded, as shown in Figure 1. From this point, all incidents
- 172 that were rated as no harm (3269) were removed from the review so only incidents with
- a harm rating of low, moderate, severe, or catastrophic were reviewed (see Figure 2).
- 174 During the in-depth review, further exclusions were applied, as shown in Figure 2.
- 175
- 176 Insert Figure 1
- 177 Insert Figure 2
- 178

Some DATIX reports involved more than one incident per report. This brought the total
number of incidents to 387. This was the total number of incidents reviewed in-depth.

182 Method for Assessing the Potential for EPMA to have Prevented Incidents

183 MC and KH (trained in the process of reviewing incident reports) reviewed each report by

- reading the original entry and any additional information, including results of any
- 185 investigations. They assessed to what extent EPMA (Nervecentre) could have reduced
- 186 the likelihood of each incident using the mutually exclusive outcomes shown below. The
- 187 classification of these outcomes took account of whether:
- 188

- 189 A. EPMA (Nervecentre) would reduce the likelihood of this incident occurring without 190 configuration. 191 192 B. EPMA (Nervecentre) could reduce the likelihood of this incident occurring with some 193 configuration. 194 195 C. EPMA could reduce the likelihood of this incident occurring with development. 196 197 D. EPMA could not reduce the likelihood of this incident occurring in any circumstances. 198 199 Any uncertainties or disagreements on outcome classification were brought to the team 200 for discussion. Incidents that were classified as being avoidable with the use of the EPMA 201 system (those classified as 1 or 2 above) were further run through EPMA test scripts to 202 determine whether the medication error scenarios were correctly categorised and 203 triggered an intervention by the EPMA system. The most common themes tested were 204 barcode scanning, duplicated administration, and drug-drug interaction. For example, 205 barcode scanning involved using an iPad or phone to scan codes for both the patient and 206 the drug before being able to administer it. Alerts were displayed if the incorrect patient 207 or drug was scanned, which would reduce the likelihood of incidents involving the wrong 208 patient and/or drug at administration.
- 209

210 Data Processing and Analysis

211 The reports on the DATIX system between 01/09/2020 and 31/08/2021 were 212 downloaded and stored in a Microsoft Excel spreadsheet, including the categorisation of 213 incidents. All reports available within the period were used (no missing data), however, 214 not all reports fitted the scope of the review (see figure 1 and 2). Each incident was 215 reviewed by reading all the information provided on the report and the potential impact 216 of EPMA was recorded on a Microsoft Excel Spreadsheet using the 4-point classification 217 system shown above. Microsoft Excel was also used to process the data and analyse the 218 results. Pivot tables were used to generate frequencies for each category and 219 subcategory and to obtain the frequencies of associated harm with each category. Pivot 220 tables were also used to obtain EPMA outcomes in relation to the category and degree of 221 harm. Descriptive statistics were determined and are reported.

222 **Results**

223 Of the 387 incidents reviewed, over half (55.6%, 215 incidents) were administration 224 related. Within this category, the largest subcategory (17.3%, 67 incidents) was `non-225 administration / dose omitted or significantly delayed', which was often due to poor 226 communication, human error (e.g., forgetting to give drug), distractions and low staff 227 numbers. Incidents classified as 'Other' accounted for 26.4% (102 incidents) of the total 228 number of incidents. New adverse drug reaction contributed the most to this category 229 with 44 incidents (43.1%) The frequency of incidents within each category and sub-230 category are shown in Table 1.

231

Most incidents reviewed were classified as low harm (83%, 321 incidents), with the remaining classified as moderate harm (16.5%, 64 incidents) apart from two incidents (one severe and one catastrophic). In relation to administration incidents, 89.8% (n=193) were low harm and 10.2% (n=22) were moderate harm. The category 'Other' consisted of all four categories of harm: 65.7% low harm (67 incidents), 32.4% moderate harm (33 incidents), 1.0% severe harm (1 incident) and 1.0% catastrophic harm (1 incident). Table 2 shows incidents by level of harm.

239

240 Table 1: Frequency of Incidents Within Each Category and Subcategory

Subcategory of Incidents	Number of	Percentage (%) of
	Incidents	total number of
		Incidents
Administration - drug incompatibility	3	0.8
Administration - incorrect day or time	14	3.6
Administration - incorrect dose	32	8.3
Administration - incorrect drug	16	4.1
Administration - incorrect frequency	20	5.2
Administration - incorrect rate	10	2.6
Administration - incorrect route	11	2.8
Administration - non-administration /	67	17.3
dose omitted or significantly delayed		
Administration - self-administration error	6	1.6

Administration - extravasation	36	9.3
SUBTOTAL ADMINISTRATION INCIDENTS	215	55.6
Discharge - delay in Pharmacy processing	4	1.0
of TTO		
Discharge - delay in prescribing of TTO	2	0.5
Discharge - patient discharged with	8	2.1
incomplete set of medication or no		
medication		
SUBTOTAL DISCHARGE INCIDENTS	14	3.6
Other - clinical trial error (prescribing,	4	1.0
dispensing, administration, protocol		
violation)		
Other - contraindication to the use of the	16	4.1
medicine		
Other - discrepancy in medication	4	1.0
documentation records (CDs, drug chart,		
etc.)		
Other - drug wastage (financial loss)	6	1.6
Other - faulty medicinal product	2	0.5
Other - incorrect injectable drug	4	1.0
preparation: prescribing, administration,		
manufacturing (incorrect		
concentration/diluent, incorrect volume,		
incorrect drug /dose, incorrect label/		
details missing on label)		
Other - incorrect monitoring / failure to	7	1.8
monitor therapeutic levels		
Other - mismatching between patient and	2	0.5
medicine (misidentification)		
Other - missing medication or drug chart	5	1.3
Other - new adverse drug reaction /	44	11.4
unexpected response / oversensitivity to		
drug		
Other - patient with known allergy	4	1
prescribed or administered a drug they		
are allergic to		
Other - storage or transportation issues	2	0.5
Other - wrong expiry / omitted expiry /	2	0.5
passed expiry date		
SUBTOTAL OTHER INCIDENTS	102	26.4

Pharmacy - clinical pharmacist screening error	2	2.6 242
Pharmacy - incorrect directions on label	1	0.3
Pharmacy - incorrect information or	1	0.3
pharmacy advice (endorsement on chart,		
verbal or written information)		
Pharmacy - significant delay in supply or	1	0.3
failure to supply (not $TTOs$)		
Pharmacy - transcription error	1	0.3
Pharmacy - Unavailable Medication Stock	4	1.0
SUBTOTAL PHARMACY INCIDENTS	10	2.6
Prescribing - failure to prescribe a	10	2.6
planned prescription		
Prescribing - incorrect day or time	3	0.8
Prescribing - incorrect dose	19	4.9
Prescribing - incorrect drug	10	2.6
Prescribing - incorrect frequency	3	0.8
Prescribing - incorrect rate	1	0.3
SUBTOTAL PRESCRIBING INCIDENTS	46	11.9
GRAND TOTAL	387	100

245	Table 2: Frequency and Type of Reported In	cidents Associated With Harm
-----	--	------------------------------

Category of Type	Level of Harm associated with Incident (row % of each				
of Incident	category)				
	Low	Moderate	Severe	Catastrophic	incidents
					in
					category)
Administration	193 (89.8)	22 (10.2)	0	0	215
					(55.6)
Discharge	14 (100)	0	0	0	14 (3.6)
Other	67 (65.7)	33 (32.4)	1 (1.0)	1 (1.0)	102
					(26.4)
Pharmacy	8 (80.0)	2 (20.0)	0	0	10 (2.6)
Prescribing	39 (84.8)	7 (15.2)	0	0	46 (11.9)
Total (% of total	321 (83.0)	64 (16.5)	1 (0.3)	1 (0.3)	387 (100)
incidents)					

246

Of the 33 incidents in the 'Other' category that were of moderate harm, 24 (72.7%)
were due to a new adverse drug reaction, unexpected response to a drug or
oversensitivity to a drug. Most of these incidents relate to opioid sensitivity.

250

251 In 18.6% (n = 72) of all incidents, the likelihood of the incident occurring could have 252 been reduced by EPMA without configuration, 18.1% (13 incidents) of these were in the 253 moderate harm category with none in the severe or catastrophic category. Nearly two 254 thirds (65.3%, n = 47) of the incidents that would have been reduced by EPMA without 255 configuration were in the category 'administration', which included drug-drug interaction 256 and duplicate administration. A further 7.5% (n = 29) of the incidents could have been 257 reduced by EPMA with configuration, 20.1% (6 incidents) of these were in the moderate 258 or severe harm categories (5 moderate harm incidents and 1 severe harm incident). The 259 vast majority of these incidents (79.3%, n = 23) were administration and prescribing, 260 most of these were due to an incorrect dose. In 11.1% (n = 43) of all incidents, the 261 likelihood of the incident occurring could have been reduced by an EPMA system with 262 further development, 9.3% (4 incidents) of these incidents were in the moderate harm

category, with none in the severe or catastrophic category. Nearly 50% (21 out of 43)
were administration related, mostly within the subcategories of incorrect dose, frequency
and non-administration. Development needed to prevent the incorrect dosing was mostly
linking the system with infusions (including guard rails) and integration with laboratory
data. Half (10 out of the 21) of the administration incidents were neonatal related, with
8 of these involving gentamicin dosing (within incorrect frequency, dose or day or time
subcategories).

270

271 Our study suggests that EPMA would not be able to reduce the likelihood of the incident in 62.8% (n = 243) of all incidents where harm was identified (see Table 3), 53.9% (n 272 273 =131) of these incidents were classed as 'Administration' and 29.6% (n = 72) were 274 'Other'. Just over half (60.9%, 131 out of 215) of the administration incidents could not 275 have been prevented by EPMA under any circumstance. Most of these incidents were due 276 to lack of communication, distractions, or shortage in staff – where EPMA has no impact. 277 For prescribing incidents, 45.7% (21 out of 46) could not have been prevented by EPMA 278 with many falling in the 'failure to prescribe' and 'incorrect dose' categories, where the 279 latter is not always preventable by EPMA systems that do not have clinical decision 280 support capabilities. For the vast majority of 'Other' incidents (70.6%, 72 out of 102), 281 EPMA could not have reduced the likelihood of the incident occurring, with all incidents 282 classified as new adverse drug reaction having this outcome.

283

Table 3 shows that in about 20% of incidents associated with low harm (18.4%, n = 59) and moderate harm (20.3%, n = 13), EPMA could have reduced the likelihood of the incident occurring without configuration. In contrast, 62.3% (n = 200) of low harm incidents and 65.6% (n = 42) of moderate harm could not have been prevented with EPMA.

289

290

291

Table 3: Degree of Harm and associated EPMA Outcome

Degree of Harm of	FPMA Outcome* (row % per degree of harm)				Grand Total
2 09.00 0					
Incidents	A	В	C	D	(column % of
					total)
Low	59 (18.4)	23 (7.2)	39 (12.2)	200 (62.3)	321 (83.0)
Moderate	13 (20.3)	5 (7.8)	4 (6.3)	42 (65.6)	64 (16.5)
Severe	0	1 (100)	0	0	1 (0.3)
Catastrophic	0	0	0	1 (100)	1 (0.3)
Grand Total (% of total)	72 (18.6)	29 (7.5)	43 (11.1)	243 (62.8)	387 (100)

* Outcomes:

A. EPMA (Nervecentre) would reduce the likelihood of this incident occurring without configuration.

B. EPMA (Nervecentre) could reduce the likelihood of this incident occurring with some configuration.

C. EPMA could reduce the likelihood of this incident occurring with development.

D. EPMA could not reduce the likelihood of this incident occurring in any circumstances.

298 299

295

296

297

300 **Discussion**

301 Summary of Findings

302 This study found that administration incidents were the most common type of

medication-related incidents that caused patient harm (n = 179, 46.3%). Most of the

incidents that caused patient harm were classified as low harm (n = 321, 83.0%) with

305 64 (16.5%) classified as moderate harm. In 18.6% of all harmful incidents (n=72), the

306 likelihood of the incident occurring could have been reduced by EPMA without additional

307 configuration, and a further 7.5% (n=29) of incidents would have been reduced with

308 configuration. Most of the incidents (62.8%, n =243) could not be mitigated by EPMA in

any circumstance, even with integration with other technologies. For 18.4% of the low-

310 harm incidents (n=59) and 20.3% (n=13) of the moderate-harm incidents, EPMA could

311 reduce the likelihood of the incident occurring without configuration. Most of the low-

harm (n=200, 62.3%) and moderate-harm (n = 42, 65.6%) incidents could not be

313 reduced under any circumstance, which provides scope for further development of EPMA

314 systems.

315

316 Strengths and Limitations

Reporting systems in hospitals, such as DATIX, will inevitably involve underreportinggiven that reporting is voluntary and time consuming, which means that reporting bias is

a limitation of our study. Therefore, the DATIX reports in this study may not be fully
representative of all incidents occurring. We analysed reported incidents, which means
that incidents that could not have been prevented by any EPMA system, such as new
adverse drug reactions, were included in our analysis, and is a limitation of our study.
This study reviewed only harmful incidents, thus focusing on what might be regarded as
the most important incidents, but potentially missing out on learning from no-harm
incidents that had the potential to cause harm.

326

It was noted that DATIX reports often varied in detail and sometimes this meant it was down to the reviewer's interpretation to decide where in the medication process the error occurred when assessing the potential impact of EPMA. To overcome this problem, any uncertain or ambiguous reports were taken to the wider team to discuss; in some cases, reports were excluded due to insufficient detail (see Figure 2).

332

Nervecentre was used as the EPMA system for this study. Other systems implemented in
different hospitals may offer different benefits and liabilities, but the experience of our
team suggests that our assessments are applicable to other EPMA systems used in the
NHS.

337

338 The classification system we use for medication incidents was based on the DATIX 339 reporting system which is commonly used in the UK. We acknowledge that this makes it 340 difficult to make comparisons with international studies of incident reporting, although 341 the World Health Organisation recognises that there are several different systems for 342 classifying patient safety incidents and the data from them are not directly comparable 343 [15]. Also, we note that the main purpose of the study was to assess the preventability 344 of incidents by EPMA, and here we have been able to make some comparisons with the 345 international literature.

346

347

348 *Comparison with Existing Literature*

349 The findings show that administration incidents are the most common type of patient 350 harm incidents reported at the Trust. Although this is consistent with current national 351 estimates [6], the national figures show that administration incidents contribute an even 352 higher proportion of total incidents. The reduction of incidents by EPMA shown in this 353 study is supported by studies that have looked at error rates before and after EPMA 354 implementation, which found that error rates were reduced [16-20]. For example, 355 Franklin [20] found that the introduction of an electronic prescribing system reduced the 356 percentage of prescribing errors by 47%.

357

358 Gates [21] concluded that although electronic systems significantly reduced prescribing 359 errors, he found no significant effect of electronic prescribing systems on patient harm. 360 Westbrook [22] also found that an electronic medication management system reduced 361 prescribing error rates, but there was no evidence of a reduction in harm. In contrast, 362 our research found that 37.8% of low harm incidents (n=121) and 34.4\% of moderate 363 harm incidents (n=22) could be reduced by EPMA, on its own, with configuration or with 364 development, which agrees with Holdsworth [23] who found that EPMA reduced 365 medication errors that caused harm.

366

367 Implications for secondary care

368 This study has identified the potential impact of EPMA on medication-related harm in one 369 NHS Trust, but the findings are likely to be relevant to secondary care in the UK and 370 beyond. It is important to recognise that while certain types of incidents can be 371 prevented by EPMA, others are less amenable to electronic solutions. This includes 372 incidents where the predominant causes are communication failures, distractions, 373 inadequate staff numbers, and failures such as drug extravasation; strategies in addition 374 to EPMA are needed to address these types of incidents. In a survey of chief pharmacists 375 in NHS Trusts, Shemilt [24] found that although electronic prescribing systems enforced

policies through the use of mandatory fields, staff would sometimes bypass these fieldsin order to expedite workflow.

378

379 In addition, it is important for healthcare providers to be aware that there can be

380 unintended adverse consequences from EPMA [25,26], although the benefits generally

381 outweigh the risks. Negative consequences can include an increase in clinician workload

and changes in clinical workflow [25]. Discrepancies between the structured and free-

text portions of the electronic record can lead to adverse drug events [26].

384 Understanding the adverse consequences of EPMA will enable developers to improve

385 their systems.

386

387 Acknowledgements

388 The authors wish to acknowledge the support of Nottingham University Hospitals (NUH)

389 NHS Trust in providing the reports that were used in this paper.

390 Author Contributions

391 TA, TH, TD, AK and BI designed the study. MC and KH conducted and analysed the study

392 with support from all the other authors. MC and KH wrote the work up and BB wrote the

393 first draft of the publication. All authors reviewed and commented on the draft

394 publication and BB edited the final manuscript.

395 Financial Disclosure Statement

396 No financial support was provided.

397 **Competing Interests**

398 The authors report no competing interests.

399

400

401 Ethical Approval

- 402 The study was approved by the Clinical Effectiveness Department at the Nottingham
- 403 University Hospital NHS Trust; ethical committee approval was not required.

404

405 **References**

- 406 1) Ioannidis JP, Lau J. Evidence on interventions to reduce medical errors: an overview
 407 and recommendations for future research. *Journal of General Internal Medicine*.
 408 2001;16(5):325-34.
- 409 2) Bates DW, Cullen DJ, Laird N, et al. Prevention study group. Incidence of adverse
- 410 drug events and potential adverse drug events. Implications for prevention. *JAMA*.
 411 1995;274(1):29-34.
- 412 3) Bates DW, Teich JM, Lee J, et al. The Impact of Computerized Physician Order Entry
- 413 on Medication Error Prevention. *J Am Med Inform Assoc.* 1999;6(4):313-21.
- 414 4) NHS Digital. DCB0160: Clinical risk management: it's application in the deployment
- 415 and use of health IT systems. Available at: <u>https://digital.nhs.uk/data-and-</u>
- 416 information/information-standards/information-standards-and-data-collections-including-
- 417 <u>extractions/publications-and-notifications/standards-and-collections/dcb0160-clinical-</u>
- 418 risk-management-its-application-in-the-deployment-and-use-of-health-it-systems
- 419 (Accessed 14 December 2022).
- 420 5) NHS England and NHS Improvement. National patient safety incident reports up to
- 421 June 2021: Data on patient safety incidents reported to the NRLS up to June 2021.
- 422 Available at: <u>https://www.england.nhs.uk/publication/national-patient-safety-incident-</u>
- 423 reports-up-to-june-2021/ (Accessed 22 December 2021).
- 424 6) Elliott RA, Camacho E, Jankovic D, et al. Economic analysis of the prevalence and
- 425 clinical and economic burden of medication error in England. *BMJ Qual Saf*.
- 426 2021;30(2):96-105.
- 427 7) Vincent C, Neale G, Woloshynowych M. Adverse events in British hospitals:
- 428 preliminary retrospective record review. *BMJ.* 2001;322(7285):517-9.

- 429 8) von Laue NC, Schwappach DL, Koeck CM. The epidemiology of preventable adverse
- 430 drug events: a review of the literature. *Wien Klin Wochenschr*. 2003;115(12):407-15.
- 431 9) Williams D. Medication Errors. J R Coll Physicians Edinb 2007; 37:343–346. 2007
- 432 RCPE. Available at: <u>https://www.rcpe.ac.uk/journal/issue/journal_37_4/Williams.pdf</u>
- 433 (Accessed 3 January 2022).
- 434 10) Kaushal R, Bates DW. Information technology and medication safety: what is the
 435 benefit? *Qual Saf Health Care*. 2002;11(3):261-5.
- 436 11) Kwan JL, Lo L, Ferguson J, Goldberg H, et al. Computerised clinical decision support
- 437 systems and absolute improvements in care: meta-analysis of controlled clinical trials.
- 438 *BMJ.* 2020 Sep 17;370.
- doi: 10.1136/bmj.m3216.
- 440 12) Mushcab H, Bunting D, Yami S, et al. An evaluation of Datix implementation for
- incident reporting at Johns Hopkins Aramco Healthcare. *J Patient Saf Risk Manag.* 2020
 Apr;25(2):67-74.
- 443 13) National Patient Safety Agency (Great Britain). Patient Safety Observatory. Safety in
- doses: medication safety incidents in the NHS. National Patient Safety Agency; 2007.
- 445 14) NHS England and NHS Improvement. The National Patient Safety Improvement
- 446 Programmes. 2021. Available at: <u>https://www.england.nhs.uk/patient-safety/patient-</u>
- 447 <u>safety-improvement-programmes/#MedSIP</u> (Accessed 3 January 2022).15) World Health
- 448 Organization. World alliance for patient safety: WHO draft guidelines for adverse event
- reporting and learning systems: from information to action. World Health Organization;2005.
- 451 16) Jani YH, Barber N, Wong ICK. Paediatric dosing errors before and after electronic
 452 prescribing. *Qual Saf Health Care.* 2010;19(4):337-40.
- 453 17) Neal C, Naik H, Fletcher P, et al. Drug errors before and after implementation of
- 454 electronic prescribing on paediatric intensive care unit. *Arch Dis Child.* 2010;95(Suppl455 1):A44-A.

- 456 18) Roumeliotis N, Sniderman J, Adams-Webber T, et al. Effect of Electronic Prescribing
 457 Strategies on Medication Error and Harm in Hospital: a Systematic Review and Meta458 analysis. *J Gen Intern Med.* 2019;34(10):2210-23.
- 459 19) van Doormaal JE, van den Bemt PM, Zaal RJ, et al. The influence that electronic
- 460 prescribing has on medication errors and preventable adverse drug events: an
- 461 interrupted time-series study. *J Am Med Inform Assoc.* 2009;16(6):816-25.
- 462 20) Franklin BD, O'Grady K, Donyai P, et al. The impact of a closed-loop electronic
- 463 prescribing and administration system on prescribing errors, administration errors and
- 464 staff time: a before-and-after study. BMJ Qual Saf. 2007;16(4):279-84.21) Gates PJ,
- 465 Hardie RA, Raban MZ, et al. How effective are electronic medication systems in reducing
- 466 medication error rates and associated harm among hospital inpatients? A systematic
- 467 review and meta-analysis. J Am Med Inform Assoc. 2021;28(1):167-76.
- 468 22) Westbrook JI, Li L, Raban MZ, Mumford V, Badgery-Parker T, Gates P, Fitzpatrick E, Merchant
- 469 A, Woods A, Baysari M, McCullagh C. Short-and long-term effects of an electronic medication
- 470 management system on paediatric prescribing errors. *Digit Med.* 2022 Dec 13;5(1):1-9.
- 471 23) Holdsworth MT, Fichtl RE, Raisch DW, et al. Impact of computerized prescriber order
- 472 entry on the incidence of adverse drug events in pediatric inpatients. *Pediatrics*. 2007
- 473 Nov;120(5):1058-66.
- 474 24) Shemilt K, Morecroft CW, Ford JL, et al. Inpatient prescribing systems used in NHS
 475 acute trusts across England: a managerial perspective. *Eur J Hosp Pharm.*
- 476 2017;24(4):213-7.
- 477 25) Campbell EM, Sittig DF, Ash JS, et al. Types of unintended consequences related to
 478 computerized provider order entry. *J Am Med Inform Assoc*. 2006;13(5):547-56.
- 479 26) Palchuk MB, Fang EA, Cygielnik JM, et al. An unintended consequence of electronic
- 480 prescriptions: prevalence and impact of internal discrepancies. *J Am Med Inform Assoc*.
 481 2010;17(4):472-6.
- 482
- 483

- Figure 1: Flowchart showing the number of incidents identified in the outpatient setting and excluded before the in-depth review of incidents

Figure 2: Flowchart showing the change in number of incidents during the in-depth review.