

BMJ Open is committed to open peer review. As part of this commitment we make the peer review history of every article we publish publicly available.

When an article is published we post the peer reviewers' comments and the authors' responses online. We also post the versions of the paper that were used during peer review. These are the versions that the peer review comments apply to.

The versions of the paper that follow are the versions that were submitted during the peer review process. They are not the versions of record or the final published versions. They should not be cited or distributed as the published version of this manuscript.

BMJ Open is an open access journal and the full, final, typeset and author-corrected version of record of the manuscript is available on our site with no access controls, subscription charges or pay-per-view fees (<u>http://bmjopen.bmj.com</u>).

If you have any questions on BMJ Open's open peer review process please email <u>info.bmjopen@bmj.com</u>

BMJ Open

## **BMJ Open**

#### Systematic review protocol assessing the potentiality of algorithms and artificial intelligence adoption to disrupt patient care with a safer and faster medication management.

Journal:	BMJ Open
Manuscript ID	bmjopen-2021-057399
Article Type:	Protocol
Date Submitted by the Author:	15-Sep-2021
Complete List of Authors:	Oliva, Antonio; Università Cattolica del Sacro Cuore, Department of Health Surveillance and Bioethics, Section of Legal Medicine Altamura, Gerardo; Università Cattolica del Sacro Cuore, Department of Life Sciences and Public Health Nurchis, Mario Cesare; Fondazione Policlinico Universitario Agostino Gemelli IRCCS, Department of Woman and Child Health and Public Health Zedda, Massimo; Università Cattolica del Sacro Cuore, Department of Health Surveillance and Bioethics, Section of Legal Medicine Sessa, Giorgio; Università Cattolica del Sacro Cuore, Department of Life Sciences and Public Health Cazzato, Francesca; Università Cattolica del Sacro Cuore, Department of Health Surveillance and Bioethics, Section of Legal Medicine Aulino, Giovanni; Università Cattolica del Sacro Cuore, Department of Health Surveillance and Bioethics, Section of Legal Medicine Sapienza, Martina; Università Cattolica del Sacro Cuore, Department of Health Surveillance and Bioethics, Section of Legal Medicine Sapienza, Martina; Università Cattolica del Sacro Cuore, Department of Life Sciences and Public Health Riccardi, Maria Teresa; Università Cattolica del Sacro Cuore, Department of Life Sciences and Public Health Della Morte, Gabriele; Università Cattolica del Sacro Cuore, Department of Juridical Science Grassi, Simone; Università Cattolica del Sacro Cuore, Department of Juridical Science Grassi, Simone; Università Cattolica del Sacro Cuore, Department of Health Surveillance and Bioethics, Section of Legal Medicine Damiani, Gianfranco; Università Cattolica del Sacro Cuore, Department of Health Surveillance and Bioethics, Section of Legal Medicine Damiani, Gianfranco; Università Cattolica del Sacro Cuore, Department of Health Surveillance and Bioethics, Section of Legal Medicine Damiani, Gianfranco; Università Cattolica del Sacro Cuore, Department of Life Sciences and Public Health; Fondazione Policlinico Universitario Agostino Gemelli IRCCS, Department of Woman and Child Health and Public Health
Keywords:	PUBLIC HEALTH, Risk management < HEALTH SERVICES ADMINISTRATION & MANAGEMENT, PRIMARY CARE

1 2	
3	
4 5	SCHOLARONE™ Manuscripte
6	Manuscripts
7	
8 9	
10	
11	
12 13	
14	
15 16	
17	
18	
19 20	
20	
22	
23 24	
25	
26	
27 28	
29	
30	
31 32	
33	
34	
35 36	
37	
38 39	
40	
41	
42 43	
44	
45	
46 47	
48	
49	
50 51	
52	
53	
54 55	
56	
57	
58 59	
60	For peer review only - http://bmjopen.bmj.com/site/about/guidelines.xhtml

## Systematic review protocol assessing the potentiality of algorithms and artificial intelligence adoption to disrupt patient care with a safer and faster medication management.

Oliva A<sup>1,°</sup>, Altamura G<sup>2,°</sup>, Nurchis MC<sup>3,\*</sup>, Zedda M<sup>1</sup>, Sessa G<sup>2</sup>, Cazzato F<sup>1</sup>, Aulino G<sup>1</sup>, Sapienza M<sup>2</sup>, Riccardi MT<sup>2</sup>, Della Morte G<sup>4</sup>, Caputo M<sup>5</sup>, Grassi S<sup>1,§</sup>, Damiani G<sup>2,3,§</sup>

°Antonio Oliva and Gerardo Altamura, contributed equally to this work and thus should be considered co-first Authors.

<sup>§</sup>Gianfranco Damiani and Simone Grassi are co-senior Authors.

\*Mario Cesare Nurchis is the corresponding Author. E-mail: <u>nurchismario@gmail.com</u>; Department of Woman and Child Health and Public Health, Fondazione Policlinico Universitario A. Gemelli IRCCS, Largo Francesco Vito 1, 00168, Rome, Italy.

<sup>1</sup> Department of Health Surveillance and Bioethics, Section of Legal Medicine, Fondazione Policlinico A. Gemelli IRCCS, Università Cattolica del Sacro Cuore, Rome, Italy. <u>antonio.oliva@unicatt.it;</u> <u>massimo\_zedda@icloud.com;</u> <u>francescacazzato993@gmail.com;</u> <u>aulinogiovanni@gmail.com;</u> <u>simone.grassi@unicatt.it</u>

<sup>2</sup> Department of Life Sciences and Public Health, Università Cattolica del Sacro Cuore, Rome, Italy. <u>martina.sapienza93@gmail.com;</u> <u>gerardoaltamura@outlook.it;</u> <u>giorgio.sessa@gmail.com;</u> <u>mt.riccardi@gmail.com;</u> <u>gianfranco.damiani@unicatt.it</u>

<sup>3</sup> Department of Woman and Child Health and Public Health, Fondazione Policlinico Universitario A. Gemelli IRCCS, Rome, Italy. <u>nurchismario@gmail.com</u>

<sup>4</sup>Faculty of Law, Università Cattolica di Milano, Italy. <u>gabriele.dellamorte@unicatt.it</u>

<sup>5</sup> Section of Criminal Law, Department of Juridical Science, Università Cattolica Del Sacro Cuore, Milan, Italy. <u>matteo.caputo@unicatt.it</u>

#### ABSTRACT

#### Introduction

In primary care, almost 75% of outpatient visits by family doctors and general practitioners involve continuation or initiation of drug therapy. Due to the enormous amount of drugs used by outpatients in unmonitored situations, the potential risk of adverse events due to an error in the use or prescription of drugs is much higher than in a hospital setting. Artificial Intelligence application can help healthcare professionals to take charge of patient safety by improving error detection, patient stratification and drug management. The aim is to investigate the impact of AI algorithms on drug management in primary care settings and to compare Artificial Intelligence or algorithms with standard clinical practice to define the medication fields where a technological support could lead to better results.

#### Methods and Analysis

A systematic review and meta-analysis of literature will be conducted querying PubMed, Cochrane and ISI Web of Science. The primary outcome will be the reduction of medication errors obtained by AI application. The search strategy and the study selection will be conducted according to the Preferred Reporting Items for Systematic Reviews and Meta-Analyses (PRISMA) and the Population, Intervention, Comparator, Outcome (PICO) framework. Quality of included studies will be appraised adopting the Quality Assessment Tool for Observational Cohort and Cross-Sectional Studies for non-randomized controlled trials (NRCTs) as well as the Quality Assessment of Controlled Intervention Studies of National Institute of Health for randomized controlled trials (RCTs).

#### **Ethics and Dissemination**

Formal ethical approval is not required since no human beings are involved. The results will be disseminated widely through peer-reviewed publications.

KEYWORDS Artificial intelligence; Primary Care; Public Health; Legal Medicine; Risk Management

4 5

6 7

8

9

10

11

12 13 14

15 16

17

18

19

20

21

22

23

24

25

26

27

28

29

30

31

32 33

34

35 36

37

38

39 40

41

42

43

44

45 46

47

48

49

50

51

52

53 54

55 56 57

58

59

60

#### ARTICLE SUMMARY

#### STRENGTHS AND LIMITATIONS OF THIS STUDY

- Robust and reproducible process for systematic review of the literature according to the guidelines of PRISMA.
- Meticulous studies quality assessment will be carried out.
- There could be an eventual lack of homogeneity of patient safety indicators
- There might be a low and inconsistent quality of included studies.

#### INTRODUCTION

Patient safety is a global public health issue. Adverse drug events (ADEs) and medication errors are frequent preventable causes of increased morbidity, mortality, hospitalization rates and healthcare costs<sup>1</sup>. According to Williams, medical errors can be sub-grouped into three classes: prescribing, dispensing and administration  $\rm errors^2$ . The preventability of these events is a critical factor that must be carefully interpreted. Indeed, the evaluation of causal inference is often critical because adverse events can be associated both to adverse drug reactions (usually unpreventable) and to medication errors (preventable since related to human decisions)<sup>3</sup>. According to the Institute of Medicine, 1 of 131 outpatient and 1 of 854 inpatient deaths are caused by medication errors<sup>4</sup>. However, there is little evidence on the real incidence of errors, especially in primary care setting<sup>5</sup>. Primary care is a complex system composed by healthcare professionals - working within sociosanitary structures - that provide first medical care for acute diseases and guarantee continuity of assistance in chronic pathologies. Three-fourths of the visits of family doctors concerns the indication or the follow-up of a pharmacological treatment<sup>6</sup>. Outpatients are significantly more exposed to a risk of drug misuse (and thus of adverse events) than inpatients because of the lack of a strict medical monitoring<sup>7</sup>. Since primary care is a heterogeneous and complex setting and – as said – drug-related errors are extremely frequent, artificial intelligence (and, in particular, e-health) could have a significant impact on the safety and the quality of care in this field. In particular, the clinical decision-making can be supported and empowered by algorithms<sup>8</sup>. In particular, electronic health records and electronic support systems based on algorithms could enhance the compliance with standards, avoid preventable errors and tailor the treatment on the basis of the specific characteristics and needs of the patients<sup>9,10</sup>. The aim of the study is to investigate the impact of AI algorithms on drug management in primary care settings. Furthermore, we aim to compare Artificial Intelligence or algorithms with standard clinical practice to define the medication fields where a technological support could lead to better results.

#### METHODS AND ANALYSIS

The synopsis for this systematic review is prospectively submitted in the International Prospective Register of Systematic Reviews (PROSPERO).

Important amendments and updates made to the protocol will be documented and published alongside the results of the systematic review.

#### Search strategy

A comprehensive search strategy will be created and implemented according to the Preferred Reporting Items for Systematic Reviews and Meta-Analyses Protocols (PRISMA-P) checklist<sup>11</sup>. The Population, Intervention, Comparison, Outcome (PICO) framework<sup>12</sup> was adopted to formulate the following research question: "Do Artificial Intelligence and Algorithms in primary care have the potentiality to disrupt patient care with a safer and faster medication management?". MEDLINE (via PubMed), Cochrane and ISI Web of Science databases will be queried to retrieve relevant peer-reviewed articles. Initially, controlled descriptors and the relative keywords were identified and verified in each scientific database. Afterwards, a Boolean search string, combining Medical Subject Headings terms (MeSH) and free-text words, such as "primary care", "algorithms", "machine learning", "deep learning", "neural networks", "medication error", " adverse event", "prescribing error", "dispensing error", "administration error", "monitoring error", "medication errors reporting", "medication reconciliation", will be used. In addition, the reference lists of all relevant articles and the references for additional data sources missed during the database search will be scanned (i.e., snowball search) and their full texts will be retrieved.

#### Study Selection Criteria

All the articles that will meet the inclusion criteria will be included in the systematic review. Table 1 provides a brief summary of the main elements considered in the PICO model.

Table 1. Inclusion and Exclusion Criteria

PICO	Inclusion Criteria Exclusion Criteria				
Population	General population in primary care	Patients in secondary, tertiary and quaternary care			
Intervention	Analysis of the application of AI/Algorithms in primary care for reducing medications errors	_			
Comparator	General practice	-			
Outcomes	Reduction of preventable medication errors that results in a decrease in hospital admissions, emergency department visits, and mortality.	Studies not reporting any outcomes			

Additionally, the inclusion will be restricted to articles written in English describing RCT, clinical trials or controlled trials. The search strategy will be also restricted by availability of full texts published in peer-reviewed journals.

The primary outcome measures will be the reduction of preventable medication errors that resulted in a decrease in hospital admissions, emergency department visits, and mortality through the application of artificial intelligence or algorithms to primary care settings.

The secondary outcome will be the identification of the medication fields where technological support could lead to better results.

#### Screening and Data Extraction

After the removal of duplicate articles, and according to the inclusion and exclusion criteria, four independent researchers (FC, GA, MTR and MZ) will conduct the initial screening by evaluating the titles and abstracts. Then, the same researchers will screen the full text of each study to determine the potential eligibility. In both of the two screening phases, any disagreements or ambiguous situations will be resolved by a fifth author by discussing the inclusion and exclusion criteria of the article.

Data extraction will be completed by three independent investigators (MCN, SG and MS). A data extraction spreadsheet will be designed including the following: (1) study characteristics (i.e. first author, publication year, country of the study, journal title, article title); (2) setting characteristics (i.e. home setting, ambulatory, nursery home); (3) methodological characteristics (i.e. study type, duration of intervention, sample size, target population, type of medication error, type of intervention and comparator); and (4) the main findings (i.e., outcomes, quadruple aim, severity of avoided reaction).

#### Quality Assessment

Methodological quality of the Randomized Controlled Trials (RCTs) and Non-Randomized Controlled Trials (NRTCs) will be assessed using the Quality Assessment of Controlled Intervention Studies of National Institute of Health (NIH). This tool analyses several aspects of the included studies: population and participation rate, inclusion criteria, sample size justification, association between exposure and outcome, outcome description, drop-out rate, exposure measures and assessment, confounding variables. The tool assesses 14 parameters for evaluating the internal validity of a study. For each item, the investigator could select "yes," "no," or "cannot determine/not reported/not applicable".

The scale assesses the following study-level aspects: randomization; allocation concealment; blinding;
completeness of outcome data and selective outcome reporting, drop-out rate, adherence to the intervention,
dimension of sample size.

A potential risk of bias was considered if the item was rated as "no" or "cannot determine/not reported/not applicable" were selected for the items by the reviewer. If the "yes" answers were  $\geq$ 75% of the total, an article was considered of "good" quality; if they were <75% but  $\geq$  50%, an article was scored as "fair"; if they were

 < 50%, the article was scored as "poor". So, a score of ten or greater was indicative of good methodological quality, nine to seven was fair and studies scoring below seven were deemed to be of poor quality.

Three reviewers (GA, MCN and GA) will assess independently the quality of included studies and disagreements will be resolved by a fourth reviewer (GS).

#### Descriptive analysis and meta-analysis

A narrative synthesis, including tables and figures, will be carried out for all the included manuscripts. If applicable, the pooled mean difference (MD) and 95% (CI) will be calculated to abridge continuous data<sup>13</sup>, while a proportion meta-analysis will be carried out for proportion outcomes. To deal with potential heterogeneity, a random-effects meta-analysis will be conducted<sup>14</sup>.

The I<sup>2</sup> statistic, which quantifies the degree of variability among studies due to heterogeneity rather than sample error<sup>15</sup>, as well as forest plot will be used to assess the heterogeneity.

A leave-one-out sensitivity analysis will be performed by iteratively removing one study at a time to point out if one study may influence the overall estimate of the rest of the studies.

Publication bias for each outcome will be assessed, if at least 10 studies will be included in the meta-analysis, through funnel plots, and the asymmetry of funnel plots will be tested using Egger's test.

All statistical analyses will be conducted using statistical software STATA<sup>16</sup> v.16 and two-sided P values <0.05 will be considered statistically significant.

#### Patient and Public Involvement

No patient involved.

#### ETHICS AND DISSEMINATION

Formal ethical approval is not required since the systematic review and meta-analysis will not foresee the involvement of human beings. The results will be disseminated widely through peer-reviewed publications.

**Author Contributions** The study concept was developed by AO, GD, GDM, MC. The manuscript of the protocol was drafted by GA, MCN, SG, MZ, GS, FC, GA, MS, MTR and critically revised by AO, GD, GDM, MC. AO, GD, GDM, MC developed and provided feedback for all sections of the review protocol and approved the final manuscript. The search strategy was developed by GA, MCN, SG, MZ, GS, FC, GA, MS, MTR. Study selection will be performed by FC, GA, MTR, MZ. Data extraction and quality assessment will be performed by GA, MCN, and GA, with GS as a fourth party in case of disagreements. All authors have approved the final version of the manuscript.

**Funding** This study is supported by Fondi di Ateneo, Linea D3.2-Project "Funzioni pubbliche, controllo privato. Profili interdisciplinari sulla governance senza governo della società algoritmica", Università Cattolica del Sacro Cuore, grant number R1024500180.

Competing interests None declared.



Patient consent for publication Not required.

#### REFERENCES

1. Weber RJ. Medication Safety Principles and Practices. In: DiPiro JT, Talbert RL, Yee GC, Matzke GR, Wells BG, Posey LM, eds. *Pharmacotherapy: A Pathophysiologic Approach, 10e.* McGraw-Hill Education; 2017. http://accesspharmacy.mhmedical.com/content.aspx?aid=1145217026

2. Williams DJP. Medication errors- Royal College of Physicians of Edinburgh. *R J Coll Physicians Edinb*. Published online 2007:343-346. http://www.rcpe.ac.uk/journal/issue/journal\_37\_4/Williams.pdf

3. Rowan-Robinson K. Professional, structural and organisational interventions in primary care for reducing medication errors. *Br J Community Nurs*. 2019;24(2):77-79. doi:10.12968/bjcn.2019.24.2.77

4. Wittich CM, Burkle CM, Lanier WL. Medication errors: An overview for clinicians. *Mayo Clin Proc.* 2014;89(8):1116-1125. doi:10.1016/j.mayocp.2014.05.007

5. Dean B. Prescribing errors : what's the story? *Chronic\*ill (Journal Maltese Pharm Assoc*. 2001;5:19-22.

6. Gandhi TK, Burstin HR, Cook EF, et al. Drug complications in outpatients. *J Gen Intern Med.* 2000;15(3):149-154. doi:10.1046/j.1525-1497.2000.04199.x

7. Thomsen LA, Winterstein AG, Søndergaard B, Haugbølle LS, Melander A. Systematic review of the incidence and characteristics of preventable adverse drug events in ambulatory care. *Ann Pharmacother*. 2007;41(9):1411-1426. doi:10.1345/aph.1H658

8. Jiang F, Jiang Y, Zhi H, et al. Artificial intelligence in healthcare: Past, present and future. *Stroke Vasc Neurol*. 2017;2(4):230-243. doi:10.1136/svn-2017-000101

9. Roumeliotis N, Sniderman J, Adams-Webber T, et al. Effect of Electronic Prescribing Strategies on Medication Error and Harm in Hospital: a Systematic Review and Meta-analysis. *J Gen Intern Med*. 2019;34(10):2210-2223. doi:10.1007/s11606-019-05236-8

10. Choudhury A, Asan O. Role of artificial intelligence in patient safety outcomes: Systematic literature review. *JMIR Med Informatics*. 2020;8(7). doi:10.2196/18599

11. Page MJ, McKenzie JE, Bossuyt PM, et al. The PRISMA 2020 statement: An updated guideline for reporting systematic reviews. *BMJ*. 2021;372. doi:10.1136/bmj.n71

12. Richardson WS, Wilson MC, Nishikawa J, Hayward RS. The well-built clinical question: a key to evidence-based decisions. *ACP J Club*. 1995;123(3):7-9. doi:10.7326/acpjc-1995-123-3-a12

13. Deeks JJ, Higgins JPT, Altman DG (editors). Chapter 10: Analysing data and undertaking metaanalyses. In: Higgins JPT, Thomas J, Chandler J, Cumpston M, Li T, Page MJ, Welch VA (editors). Cochrane Handbook for Systematic Reviews of Interventions version 6.

14. DerSimonian R, Laird N. Meta-analysis in clinical trials. Control Clin Trials. 1986. September;7(3):177–88.

15. Higgins JPT, Thompson SG, Deeks JJ, Altman DG. Measuring inconsistency in meta- analyses. BMJ. 2003. September 6;327(7414):557–60. 10.1136/bmj.327.7414.557).

16. StataCorp. 2016. Stata Statistical Software: Release 16. College Station, TX: StataCorp LP.

**BMJ** Open

# **BMJ Open**

#### Systematic review protocol assessing the potentiality of algorithms and artificial intelligence adoption to disrupt patient care with a safer and faster medication management.

Journal:	BMJ Open
Manuscript ID	bmjopen-2021-057399.R1
Article Type:	Protocol
Date Submitted by the Author:	04-Mar-2022
Complete List of Authors:	Oliva, Antonio; Università Cattolica del Sacro Cuore, Department of Health Surveillance and Bioethics, Section of Legal Medicine Altamura, Gerardo; Università Cattolica del Sacro Cuore, Department of Life Sciences and Public Health Nurchis, Mario Cesare; Fondazione Policlinico Universitario Agostino Gemelli IRCCS, Department of Woman and Child Health and Public Health Zedda, Massimo; Università Cattolica del Sacro Cuore, Department of Health Surveillance and Bioethics, Section of Legal Medicine Sessa, Giorgio; Università Cattolica del Sacro Cuore, Department of Life Sciences and Public Health Cazzato, Francesca; Università Cattolica del Sacro Cuore, Department of Health Surveillance and Bioethics, Section of Legal Medicine Aulino, Giovanni; Università Cattolica del Sacro Cuore, Department of Health Surveillance and Bioethics, Section of Legal Medicine Sapienza, Martina; Università Cattolica del Sacro Cuore, Department of Life Sciences and Public Health Riccardi, Maria Teresa; Università Cattolica del Sacro Cuore, Department of Life Sciences and Public Health Della Morte, Gabriele; Università Cattolica del Sacro Cuore, Department of Juridical Science Grassi, Simone; Università Cattolica del Sacro Cuore, Department of Juridical Science Grassi, Simone; Università Cattolica del Sacro Cuore, Department of Health Surveillance and Bioethics, Section of Legal Medicine Damiani, Gianfranco; Università Cattolica del Sacro Cuore, Department of Health Surveillance and Bioethics, Section of Legal Medicine Damiani, Gianfranco; Università Cattolica del Sacro Cuore, Department of Health Surveillance and Bioethics, Section of Legal Medicine Damiani, Gianfranco; Università Cattolica del Sacro Cuore, Department of Health Surveillance and Bioethics, Section of Legal Medicine Damiani, Gianfranco; Università Cattolica del Sacro Cuore, Department of Life Sciences and Public Health; Fondazione Policlinico Universitario Agostino Gemelli IRCCS, Department of Woman and Child Health and Public Health
<b>Primary Subject Heading</b> :	Public health
Secondary Subject Heading:	Legal and forensic medicine, Health services research
Keywords:	PUBLIC HEALTH, Risk management < HEALTH SERVICES ADMINISTRATION & MANAGEMENT, PRIMARY CARE

1	
2	
3	
4 5	
5 6	SCHOLARONE <sup>™</sup>
7	Manuscripts
8	
9	
10	
11	
12	
13	
14	
15	
16	
17	
18	
19	
20	
21	
22	
23 24	
24 25	
26	
27	
28	
29	
30	
31	
32	
33	
34	
35	
36	
37	
38	
39	
40	
41 42	
42 43	
44	
45	
46	
47	
48	
49	
50	
51	
52	
53	
54	
55	
56	
57	
58 59	
59 60	For peer review only - http://bmjopen.bmj.com/site/about/guidelines.xhtml
~~	

## Systematic review protocol assessing the potentiality of algorithms and artificial intelligence adoption to disrupt patient care with a safer and faster medication management.

Oliva A<sup>1,°</sup>, Altamura G<sup>2,°</sup>, Nurchis MC<sup>3,\*</sup>, Zedda M<sup>1</sup>, Sessa G<sup>2</sup>, Cazzato F<sup>1</sup>, Aulino G<sup>1</sup>, Sapienza M<sup>2</sup>, Riccardi MT<sup>2</sup>, Della Morte G<sup>4</sup>, Caputo M<sup>5</sup>, Grassi S<sup>1,§</sup>, Damiani G<sup>2,3,§</sup>

°Antonio Oliva and Gerardo Altamura, contributed equally to this work and thus should be considered co-first Authors.

<sup>§</sup>Gianfranco Damiani and Simone Grassi are co-senior Authors.

\*Mario Cesare Nurchis is the corresponding Author. E-mail: <u>nurchismario@gmail.com</u>; Department of Woman and Child Health and Public Health, Fondazione Policlinico Universitario A. Gemelli IRCCS, Largo Francesco Vito 1, 00168, Rome, Italy.

<sup>1</sup> Department of Health Surveillance and Bioethics, Section of Legal Medicine, Fondazione Policlinico A. Gemelli IRCCS, Università Cattolica del Sacro Cuore, Rome, Italy. <u>antonio.oliva@unicatt.it;</u> <u>massimo\_zedda@icloud.com;</u> <u>francescacazzato993@gmail.com;</u> <u>aulinogiovanni@gmail.com;</u> <u>simone.grassi@unicatt.it</u>

<sup>2</sup> Department of Life Sciences and Public Health, Università Cattolica del Sacro Cuore, Rome, Italy. <u>martina.sapienza93@gmail.com;</u> <u>gerardoaltamura@outlook.it;</u> <u>giorgio.sessa@gmail.com;</u> <u>mt.riccardi@gmail.com;</u> <u>gianfranco.damiani@unicatt.it</u>

<sup>3</sup> Department of Woman and Child Health and Public Health, Fondazione Policlinico Universitario A. Gemelli IRCCS, Rome, Italy. <u>nurchismario@gmail.com</u>

<sup>4</sup>Faculty of Law, Università Cattolica di Milano, Italy. <u>gabriele.dellamorte@unicatt.it</u>

<sup>5</sup> Section of Criminal Law, Department of Juridical Science, Università Cattolica Del Sacro Cuore, Milan, Italy. <u>matteo.caputo@unicatt.it</u>

#### ABSTRACT

#### Introduction

In primary care, almost 75% of outpatient visits by family doctors and general practitioners involve continuation or initiation of drug therapy. Due to the enormous amount of drugs used by outpatients in unmonitored situations, the potential risk of adverse events due to an error in the use or prescription of drugs is much higher than in a hospital setting. Artificial Intelligence application can help healthcare professionals to take charge of patient safety by improving error detection, patient stratification and drug management. The aim is to investigate the impact of AI algorithms on drug management in primary care settings and to compare Artificial Intelligence or algorithms with standard clinical practice to define the medication fields where a technological support could lead to better results.

#### Methods and Analysis

A systematic review and meta-analysis of literature will be conducted querying PubMed, Cochrane and ISI Web of Science from the inception to December 2021. The primary outcome will be the reduction of medication errors obtained by AI application. The search strategy and the study selection will be conducted according to the Preferred Reporting Items for Systematic Reviews and Meta-Analyses (PRISMA) and the Population, Intervention, Comparator, Outcome (PICO) framework. Quality of included studies will be appraised adopting the Quality Assessment Tool for Observational Cohort and Cross-Sectional Studies for non-randomized controlled trials (NRCTs) as well as the Quality Assessment of Controlled Intervention Studies of National Institute of Health for randomized controlled trials (RCTs).

#### **Ethics and Dissemination**

Formal ethical approval is not required since no human beings are involved. The results will be disseminated widely through peer-reviewed publications.

KEYWORDS Artificial intelligence; Primary Care; Public Health; Legal Medicine; Risk Management

4 5

6 7

8

9

10

11

12 13 14

15 16

17

18

19

20

21

22

23

24

25

26

27

28

29

30

31

32 33

34 35

36

37

38

39

40

41

42

43

44

45 46

47

48

49

50

51 52

53 54

55

56

57

58

59

60

#### ARTICLE SUMMARY

#### STRENGTHS AND LIMITATIONS OF THIS STUDY

- Robust and reproducible process for systematic review of the literature according to the guidelines of PRISMA.
- Meticulous studies quality assessment will be carried out.
- There could be an eventual lack of homogeneity of patient safety indicators
- There might be a low and inconsistent quality of included studies.

#### INTRODUCTION

Patient safety is a global public health issue. Adverse drug events (ADEs) and medication errors are frequent preventable causes of increased morbidity, mortality, hospitalization rates and healthcare costs<sup>1</sup>. According to Williams, medical errors can be sub-grouped into three classes: prescribing, dispensing and administration  $\rm errors^2$ . The preventability of these events is a critical factor that must be carefully interpreted. Indeed, the evaluation of causal inference is often critical because adverse events can be associated both to adverse drug reactions (usually unpreventable) and to medication errors (preventable since related to human decisions)<sup>3</sup>. According to the Institute of Medicine, 1 of 131 outpatient and 1 of 854 inpatient deaths are caused by medication errors<sup>4</sup>. However, there is little evidence on the real incidence of errors, especially in primary care setting<sup>5</sup>. Primary care is a complex system composed by healthcare professionals - working within sociosanitary structures - that provide first medical care for acute diseases and guarantee continuity of assistance in chronic pathologies. Three-fourths of the visits of family doctors concerns the indication or the follow-up of a pharmacological treatment<sup>6</sup>. Outpatients are significantly more exposed to a risk of drug misuse (and thus of adverse events) than inpatients because of the lack of a strict medical monitoring<sup>7</sup>. Since primary care is a heterogeneous and complex setting and – as said – drug-related errors are extremely frequent, artificial intelligence (and, in particular, e-health) could have a significant impact on the safety and the quality of care in this field. In particular, the clinical decision-making can be supported and empowered by algorithms<sup>8</sup>. Artificial intelligence (AI) can be defined as "the science and engineering of making intelligent machines. especially intelligent computer programmes"9. In medicine, it can be used for the improvement of patients' diagnosis, management, and treatment. In particular, machine learning (ML) is the main branch of AI, being involved in the development of algorithms based on big data. The main implications of machine learning models concern various fields of medicine: i.e., prediction in clinical and community care settings of chronic diseases, decision-making behaviours, clinical decision support, enhancement of efficiency of medical imaging<sup>10</sup>. In particular, electronic health records and electronic support systems based on algorithms could enhance the compliance with standards, avoid preventable errors and tailor the treatment on the basis of the specific characteristics and needs of the patients<sup>11,12</sup>. The aim of the study is to investigate the impact of AI algorithms on drug management in primary care settings. Furthermore, we aim to compare Artificial Intelligence or algorithms with standard clinical practice to define the medication fields where a technological support could lead to better results.

#### METHODS AND ANALYSIS

The synopsis for this systematic review is prospectively submitted in the International Prospective Register of Systematic Reviews (PROSPERO).

Important amendments and updates made to the protocol will be documented and published alongside the results of the systematic review.

#### Search strategy

A comprehensive search strategy will be created and implemented according to the Preferred Reporting Items for Systematic Reviews and Meta-Analyses Protocols (PRISMA-P) checklist<sup>13</sup>. The Population, Intervention, Comparison, Outcome (PICO) framework<sup>14</sup> was adopted to formulate the following research question: "Do Artificial Intelligence and Algorithms in primary care have the potentiality to disrupt patient care with a safer and faster medication management?". MEDLINE (via PubMed), Cochrane and ISI Web of Science databases will be queried to retrieve relevant peer-reviewed articles. Initially, controlled descriptors and the relative keywords were identified and verified in each scientific database. Afterwards, a Boolean search string, combining Medical Subject Headings terms (MeSH) and free-text words, such as "primary care", "ambulatory care", "outpatient care", "general practitioner", "general paediatrics", "artificial intelligence", "algorithms", "machine learning", "deep learning", "neural networks", "medication error", " adverse event", "prescribing error", "dispensing error", "administration error", "monitoring error", "medication errors reporting", "medication reconciliation", will be used. In addition, the reference lists of all relevant articles and the references for additional data sources missed during the database search will be scanned (i.e., snowball search) and their full texts will be retrieved. The accuracy of the search strategy will be determined by preliminary checking for relevant studies to retrieve all the appropriate terms and synonyms, then by asking the specialists' opinions<sup>15</sup> to increase the robustness of the selected terms and synonyms, and, finally, by using the Peer Review of Electronic Search Strategies (PRESS) checklist<sup>16</sup>. The full search strategy is available in the supplementary material file (see S1).

#### Study Selection Criteria

All the articles that will meet the inclusion criteria will be included in the systematic review. Table 1 provides a brief summary of the main elements considered in the PICO model.

Table 1. Inclusion and Exclusion Criteria

PICO	Inclusion Criteria	Exclusion Criteria		
Population	General population in primary care	Patients in secondary, tertiary and quaternary care		
Intervention	Analysis of the application of AI/Algorithms in primary care for reducing medications errors	_		
Comparator	General practice	-		
Outcomes	Reduction of preventable medication errors that results in a decrease in hospital admissions, emergency department visits, and mortality.	Studies not reporting any outcomes		

Additionally, the inclusion will be restricted to original primary analyses written in English describing RCT, clinical trials or controlled trials. Thus, systematic reviews and meta-analyses will be excluded. The search strategy will be also restricted by availability of full texts published in peer-reviewed journals. Articles focusing on not digital technologies-based AI interventions will be excluded.

The primary outcome measures will be the reduction of preventable medication errors that resulted in a decrease in hospital admissions, emergency department visits, and mortality through the application of artificial intelligence or algorithms to primary care settings.

The secondary outcome will be the identification of the medication fields where technological support could lead to better results.

#### Screening and Data Extraction

After the removal of duplicate articles, and according to the inclusion and exclusion criteria, four independent researchers (FC, GA, MTR and MZ) will conduct the initial screening by evaluating the titles and abstracts. Then, the same researchers will screen the full text of each study to determine the potential eligibility. In both of the two screening phases, any disagreements or ambiguous situations will be resolved by a fifth author by discussing the inclusion and exclusion criteria of the article.

Data extraction will be completed by three independent investigators (MCN, SG and MS). A data extraction spreadsheet will be designed including the following: (1) study characteristics (i.e. first author, publication year, country of the study, journal title, article title); (2) setting characteristics (i.e. home setting, ambulatory, nursery home); (3) methodological characteristics (i.e. study type, duration of intervention, sample size, target population, type of medication error, type of intervention and comparator); and (4) the main findings (i.e., outcomes, quadruple aim, severity of avoided reaction).

#### Quality Assessment

Methodological quality of the Randomized Controlled Trials (RCTs) and Non-Randomized Controlled Trials (NRTCs) will be assessed using the Quality Assessment of Controlled Intervention Studies of National

#### **BMJ** Open

Institute of Health (NIH). This tool analyses several aspects of the included studies: population and

participation rate, inclusion criteria, sample size justification, association between exposure and outcome,

outcome description, drop-out rate, exposure measures and assessment, confounding variables. The tool

assesses 14 parameters for evaluating the internal validity of a study. For each item, the investigator could

The scale assesses the following study-level aspects: randomization; allocation concealment; blinding;

completeness of outcome data and selective outcome reporting, drop-out rate, adherence to the intervention,

A potential risk of bias was considered if the item was rated as "no" or "cannot determine/not reported/not

applicable" were selected for the items by the reviewer. If the "yes" answers were  $\geq$ 75% of the total, an article

was considered of "good" quality; if they were <75% but  $\ge 50\%$ , an article was scored as "fair"; if they were

< 50%, the article was scored as "poor". So, a score of ten or greater was indicative of good methodological

Three reviewers (GA, MCN and GA) will assess independently the quality of included studies and

quality, nine to seven was fair and studies scoring below seven were deemed to be of poor quality.

select "yes," "no," or "cannot determine/not reported/not applicable".

disagreements will be resolved by a fourth reviewer (GS).

Descriptive analysis and meta-analysis

1

29

37

39

40 41

42

43

44 45

46

47 48

49

50

51

52

53

54

55

56 57 58

A narrative synthesis, including tables and figures, will be carried out for all the included manuscripts. If applicable, the pooled mean difference (MD) and 95% (CI) will be calculated to abridge continuous data<sup>17</sup>, while a proportion meta-analysis will be carried out for proportion outcomes. Separate pooled analyses will be performed for each group of studies (i.e., RCTs and NRCTs) as well as for each included outcome. 25 Furthermore, in case of small numbers of studies will be found, the estimates for percent reduction in 26 medication errors will be pooled. To deal with potential heterogeneity, a random-effects meta-analysis will be 27 conducted<sup>18</sup>. 28

The I<sup>2</sup> statistic, which quantifies the degree of variability among studies due to heterogeneity rather than sample error<sup>19</sup>, as well as forest plot will be used to assess the heterogeneity.

30 In addition, there could be many decision nodes, such as the search of studies, eligibility criteria, type of data 31 to be extracted, and the type of analyses, within the systematic review process, that may require sensitivity 32 analyses. A leave-one-out sensitivity analysis will be performed by iteratively removing one study at a time to 33 point out if one study may influence the overall estimate of the rest of the studies. If results will be consistent 34 across the different analyses, the findings will be treated as robust while, on the contrary, they need to be 35 assessed with caution. 36

Publication bias for each outcome will be assessed, if at least 10 studies will be included in the meta-analysis, through funnel plots, and the asymmetry of funnel plots will be tested using Egger's test. 38

The main limitations related to the meta-analysis are the biases affecting primary studies, publication, reporting and selection bias, and the heterogeneity<sup>20</sup>. Nonetheless, quality assessment and sensitivity analyses will be conducted, by two independent authors, to overcome these caveats.

All statistical analyses will be conducted using statistical software STATA<sup>21</sup> v.16 and two-sided P values < 0.05 will be considered statistically significant.

#### **Patient and Public Involvement**

dimension of sample size.

No patient involved.

#### DISCUSSION

We believe that the main implication of this systematic review could be the prioritization of the medical areas in which a better result, intended as medication error reduction, has been found, creating guidelines that could make the process more efficient. In addition, given the impending PNRR Allocation of fundings for technological infrastructures, consolidating the already existing evidences addressing the efficacy of AI could help political decision-makers in allocating the resources. Finally, this systematic review might result an important tool for giving answers to some of the still existing questions relatively to safety and usability of AI machines in the health sector.

#### ETHICS AND DISSEMINATION

59 Formal ethical approval is not required since the systematic review and meta-analysis will not foresee the 60 involvement of human beings. The results will be disseminated widely through peer-reviewed publications.

**Author Contributions** The study concept was developed by AO, GD, GDM, MC. The manuscript of the protocol was drafted by GA, MCN, SG, MZ, GS, FC, GA, MS, MTR and critically revised by AO, GD, GDM, MC. AO, GD, GDM, MC developed and provided feedback for all sections of the review protocol and approved the final manuscript. The search strategy was developed by GA, MCN, SG, MZ, GS, FC, GA, MS, MTR. Study selection will be performed by FC, GA, MTR, MZ. Data extraction and quality assessment will be performed by GA, MCN, and GA, with GS as a fourth party in case of disagreements. All authors have approved the final version of the manuscript.

**Funding** This study is supported by Fondi di Ateneo, Linea D3.2-Project "Funzioni pubbliche, controllo privato. Profili interdisciplinari sulla governance senza governo della società algoritmica", Università Cattolica del Sacro Cuore, grant number R1024500180.

Competing interests None declared.

Patient consent for publication Not required.

#### 

#### REFERENCES

1. Weber RJ. Medication Safety Principles and Practices. In: DiPiro JT, Talbert RL, Yee GC, Matzke GR, Wells BG, Posey LM, eds. *Pharmacotherapy: A Pathophysiologic Approach, 10e.* McGraw-Hill Education; 2017. http://accesspharmacy.mhmedical.com/content.aspx?aid=1145217026

2. Williams DJP. Medication errors- Royal College of Physicians of Edinburgh. *R J Coll Physicians Edinb*. Published online 2007:343-346. http://www.rcpe.ac.uk/journal/issue/journal\_37\_4/Williams.pdf

3. Rowan-Robinson K. Professional, structural and organisational interventions in primary care for reducing medication errors. *Br J Community Nurs*. 2019;24(2):77-79. doi:10.12968/bjcn.2019.24.2.77

4. Wittich CM, Burkle CM, Lanier WL. Medication errors: An overview for clinicians. *Mayo Clin Proc.* 2014;89(8):1116-1125. doi:10.1016/j.mayocp.2014.05.007

5. Dean B. Prescribing errors : what's the story? *Chronic\*ill (Journal Maltese Pharm Assoc.* 2001;5:19-22.

6. Gandhi TK, Burstin HR, Cook EF, et al. Drug complications in outpatients. *J Gen Intern Med.* 2000;15(3):149-154. doi:10.1046/j.1525-1497.2000.04199.x

7. Thomsen LA, Winterstein AG, Søndergaard B, Haugbølle LS, Melander A. Systematic review of the incidence and characteristics of preventable adverse drug events in ambulatory care. *Ann Pharmacother*. 2007;41(9):1411-1426. doi:10.1345/aph.1H658

8. Jiang F, Jiang Y, Zhi H, et al. Artificial intelligence in healthcare: Past, present and future. *Stroke Vasc Neurol*. 2017;2(4):230-243. doi:10.1136/svn-2017-000101

9. Muehlematter UJ, Daniore P, Vokinger KN. Approval of artificial intelligence and machine learningbased medical devices in the USA and Europe (2015-20): a comparative analysis. *Lancet Digit Health*. 2021;3(3):e195-e203. doi:10.1016/S2589-7500(20)30292-2

10. De Silva K, Enticott J, Barton C, Forbes A, Saha S, Nikam R. Use and performance of machine learning models for type 2 diabetes prediction in clinical and community care settings: Protocol for a systematic review and meta-analysis of predictive modeling studies. *Digit Health*. 2021;28;7:20552076211047390. doi:10.1177/20552076211047390

11. Roumeliotis N, Sniderman J, Adams-Webber T, et al. Effect of Electronic Prescribing Strategies on Medication Error and Harm in Hospital: a Systematic Review and Meta-analysis. *J Gen Intern Med*. 2019;34(10):2210-2223. doi:10.1007/s11606-019-05236-8

12. Choudhury A, Asan O. Role of artificial intelligence in patient safety outcomes: Systematic literature review. *JMIR Med Informatics*. 2020;8(7). doi:10.2196/18599

13. Page MJ, McKenzie JE, Bossuyt PM, et al. The PRISMA 2020 statement: An updated guideline for reporting systematic reviews. *BMJ*. 2021;372. doi:10.1136/bmj.n71

14. Richardson WS, Wilson MC, Nishikawa J, Hayward RS. The well-built clinical question: a key to evidence-based decisions. *ACP J Club*. 1995;123(3):7-9. doi:10.7326/acpjc-1995-123-3-a12

15. Institute of Medicine (US) Committee on Standards for Systematic Reviews of Comparative Effectiveness Research. Finding What Works in Health Care: Standards for Systematic Reviews. Eden J, Levit L, Berg A, Morton S, editors. *Washington (DC): National Academies Press (US)*. 2011.

16. McGowan J, Sampson M, Salzwedel DM, Cogo E, Foerster V, Lefebvre C. PRESS Peer Review of Electronic Search Strategies: 2015 Guideline Statement. *J Clin Epidemiol*. 2016;75:40-6. doi:10.1016/j.jclinepi.2016.01.021

17. Deeks JJ, Higgins JPT, Altman DG (editors). Chapter 10: Analysing data and undertaking metaanalyses. In: Higgins JPT, Thomas J, Chandler J, Cumpston M, Li T, Page MJ, Welch VA (editors). Cochrane Handbook for Systematic Reviews of Interventions version 6.

18. DerSimonian R, Laird N. Meta-analysis in clinical trials. Control Clin Trials. 1986. September;7(3):177–88.

19. Higgins JPT, Thompson SG, Deeks JJ, Altman DG. Measuring inconsistency in meta- analyses. BMJ. 2003. September 6;327(7414):557–60. 10.1136/bmj.327.7414.557).

20. Walker E, Hernandez AV, Kattan MW. Meta-analysis: Its strengths and limitations. *Cleve Clin J Med.* 2008;75(6):431-9. doi:10.3949/ccjm.75.6.431

21. StataCorp. 2016. Stata Statistical Software: Release 16. College Station, TX: StataCorp LP.

#### **Supplementary File 1**

#### Search string

#### Pubmed

5 6

11 12

13

14

15 16

17

18

19

20 21

22

23

24 25

26 27

28

29

30

31

32

33

34 35 36

37 38

39 40

41 42

43 44

45 46

47 48

49 50 51

52 53

54 55

56 57

58 59

60

("primary care" OR "ambulatory care" OR "outpatient care" OR "basic health care" OR "basic health-care" OR "basic healthcare" OR "day-to-day health care" OR "first aid" OR "initial medical care" OR " local doctors" OR "local doctor" OR "primary medical care" OR "primary health-care" OR "primary healthcare" OR "general practitioner" OR "general practitioners" OR "GP" OR "GPs" OR "family medicine" OR "general internal medicine" OR "general paediatrics" OR "primary care physician" OR "continuity of care" OR "first aid station" OR "first-aid station" OR "medical station" OR "home care" OR "home assistance" OR "home help")

AND ("artificial intelligence" [MeSH] OR "algorithms" OR "electronic prescribing" OR "Telehealth" OR "machine learning" OR "deep learning" OR "neural networks" OR "Computational Intelligence" OR "Machine Intelligence" OR "Computer Reasoning" OR "telemedicine" [MeSH] OR "m-health" OR "mhealth" OR "mobile health" OR "ehealth" OR "e-health" OR "digital health")

AND ("Medication use" OR "adverse drug events" OR "drug prescription" OR "medication errors" [MeSH] OR "prescription errors" OR "medication error" OR "medication adverse event" OR "drug error" OR "medication administration" OR "medication prescription" OR "medication use" OR "prescribing error" OR "dispensing error" OR "omission error" OR "wrong time error" OR "monitoring error" OR "compliance error") Liezon

#### Cochrane

- ID Search Hits
- #1 104889 primary care
- #2 ambulatory care 9348
- #3 outpatient care 15467
- #4 basic health care 3678
- #5 basic health-care 1677
- basic healthcare 1432 #6
- #7 day-to-day health care 462
- #8 first aid 4818
- #9 initial medical care 9351
- #10 local doctors 912
- #11 local doctor 1043

2			
2 3 4	#12	primary medical care	38283
5 6	#13	primary health-care	29122
7 8	#14	primary healthcare	14360
9 10	#15	general practitioner	6570
11 12	#16	general practitioners	5850
13 14	#17	GP 10821	
15 16	#18	GPs 3516	
17 18	#19	family medicine11532	
19 20			
21 22	#20	general internal medici	
23	#21	general paediatrics	2610
24 25	#22	primary care physician	9669
26 27	#23	continuity of care	1867
28 29	#24	medical station 548	
30 31	#25	home care 25285	
32 33	#26	home assistance 1977	
34 35	#27	home help 4992	
36 37	#28	m-health 1541	
38 39	#29	mhealth 1683	
40 41			
42 43	#30	mobile health 6529	
44 45	#31	ehealth 1492	
46 47	#32	e-health1507	
47 48 49	#33	digital health 4314	
50 51	#34	artificial intelligence	832
52 53	#35	algorithms 6345	
53 54 55	#36	electronic prescribing	1197
56 57	#37	Telehealth 2191	
58 59	#38	machine learning	1567
60	#39	deep learning 914	

2
3 4
4
5
6
/
8
9
10 11
12
13
14
15
16
17
18
19
20
21
22
23
24
25
26
27
28
29
30
31
32
32 33
33 24
34 35
35
36
37 38
38
39
40
41
42
43
44
45
46
47
48
49
50
51
52
53
54
55
56
57
58
59
60
00

#40

#41

#42

#43

#44

#45

#46

#47

#48

#49

#50

#51

#52

#53

#54

#55

#56

#57

#58

#59

#60

#61

#62

neural networks 1133

Machine Intelligence

Computer Reasoning

adverse drug events

drug prescription

medication errors

prescription errors

medication error

prescribing error

drug dispensing error

drug omission error

drug monitoring error

drug compliance error

#59 AND #60 AND #61

163013

OR #41 OR #42 OR #43

#56 #57 OR #58

drug error

medication adverse event

medication administration

medication prescription 3836

wrong medication use 332

8040

telemedicine

216

296

84274

8231

2506

749

3113

551

94

219

1567

1534

26710

2450

118327

6904

26775

ė len

#1 OR #2 OR #3 OR #4 OR #5 OR #6 OR #7 OR #8 OR #9 OR #10 OR #11 OR #12 OR #13 OR #14

#28 OR #29 OR #30 OR #31 OR #32 OR #33#34 OR #35 OR #36 OR #37 OR #38 OR #39 OR #40

#44 OR #45 OR #46 OR #47 OR #48 OR #49 OR #50 OR #51 OR #52 OR #53 OR #54 OR #55 OR

OR #15 OR #16 OR #17 OR #18 OR #19 OR #20 OR #21 OR #22 OR #23 OR #24 OR #25 OR #26 OR #27

4543

### WoS

("primary care" OR "ambulatory care" OR "outpatient care" OR "basic health care" OR "basic health-care" OR "basic healthcare" OR "day-to-day health care" OR "first aid" OR "initial medical care" OR " local doctors" OR "local doctor" OR "primary medical care" OR "primary health-care" OR "primary healthcare" OR "general practitioner" OR "general practitioners" OR "GP" OR "GPs" OR "family medicine" OR "general internal medicine" OR "general paediatrics" OR "primary care physician" OR "continuity of care" OR "first aid station" OR "first-aid station" OR "medical station" OR "home care" OR "home assistance" OR "home help")

AND ("artificial intelligence" OR "algorithms" OR "electronic prescribing" OR "Telehealth" OR "machine learning" OR "deep learning" OR "neural networks" OR "Computational Intelligence" OR "Machine Intelligence" OR "Computer Reasoning" OR "telemedicine" OR "m-health" OR "mhealth" OR "mobile health" OR "ehealth" OR "e-health" OR "digital health")

AND ( "Medication use" OR "adverse drug events" OR "drug prescription" OR "medication errors" OR "prescription errors" OR "medication error" OR "medication adverse event" OR "drug error" OR "medication administration" OR "medication prescription" OR "medication use" OR "prescribing error" OR "dispensing error" OR "omission error" OR "wrong time error" OR "monitoring error" OR "compliance error" )

# Reporting checklist for protocol of a systematic review and meta analysis.

Based on the PRISMA-P guidelines.

#### **Instructions to authors**

Complete this checklist by entering the page numbers from your manuscript where readers will find each of the items listed below.

Your article may not currently address all the items on the checklist. Please modify your text to include the missing information. If you are certain that an item does not apply, please write "n/a" and provide a short explanation.

Upload your completed checklist as an extra file when you submit to a journal.

In your methods section, say that you used the PRISMA-Preporting guidelines, and cite them as:

Moher D, Shamseer L, Clarke M, Ghersi D, Liberati A, Petticrew M, Shekelle P, Stewart LA. Preferred Reporting Items for Systematic Review and Meta-Analysis Protocols (PRISMA-P) 2015 statement. Syst Rev. 2015;4(1):1.

		Reporting Item	Page Number
Title			
Identification	<u>#1a</u>	Identify the report as a protocol of a systematic review	1
Update	<u>#1b</u>	If the protocol is for an update of a previous systematic review, identify as such	n/a
Registration			
	<u>#2</u>	If registered, provide the name of the registry (such as PROSPERO) and registration number	2
Authors			
Contact	<u>#3a</u>	Provide name, institutional affiliation, e-mail address of all protocol authors; provide physical mailing address of corresponding author	1
Contribution	<u>#3b</u>	Describe contributions of protocol authors and identify the guarantor of the review	4
	For pe	eer review only - http://bmjopen.bmj.com/site/about/guidelines.xhtml	

1 2	Amendments			
3 4 5 6 7 8 9 10 11 12		<u>#4</u>	If the protocol represents an amendment of a previously completed or published protocol, identify as such and list changes; otherwise, state plan for documenting important protocol amendments	n/a
	Support			
	Sources	<u>#5a</u>	Indicate sources of financial or other support for the review	4
13 14	Sponsor	<u>#5b</u>	Provide name for the review funder and / or sponsor	4
15 16	Role of sponsor or	<u>#5c</u>	Describe roles of funder(s), sponsor(s), and / or institution(s), if any,	n/a
17 18	funder		in developing the protocol	
19 20	Introduction			
21 22 23 24	Rationale	<u>#6</u>	Describe the rationale for the review in the context of what is already known	2
25 26 27 28 29 30	Objectives	<u>#7</u>	Provide an explicit statement of the question(s) the review will address with reference to participants, interventions, comparators, and outcomes (PICO)	2
31 32	Methods			
32 33 34 35 36 37 38 39 40 41 42 43 44 546 47 48 49 50 51 52 53 54 55 56 57 58 59 60	Eligibility criteria	<u>#8</u>	Specify the study characteristics (such as PICO, study design, setting, time frame) and report characteristics (such as years considered, language, publication status) to be used as criteria for eligibility for the review	3
	Information sources	<u>#9</u>	Describe all intended information sources (such as electronic databases, contact with study authors, trial registers or other grey literature sources) with planned dates of coverage	2
	Search strategy	<u>#10</u>	Present draft of search strategy to be used for at least one electronic database, including planned limits, such that it could be repeated	2
	Study records - data management	<u>#11a</u>	Describe the mechanism(s) that will be used to manage records and data throughout the review	3
	Study records - selection process	<u>#11b</u>	State the process that will be used for selecting studies (such as two independent reviewers) through each phase of the review (that is, screening, eligibility and inclusion in meta-analysis)	3
	Study records - data	<u>#11c</u> For pe	Describe planned method of extracting data from reports (such as er review only - http://bmjopen.bmj.com/site/about/guidelines.xhtml	3

#### BMJ Open

1 2 3 4 5 6 7 8 9 10 11 2 3 4 5 6 7 8 9 10 11 2 3 4 5 6 7 8 9 10 11 2 3 4 5 6 7 8 9 10 11 2 3 2 4 25 26 7 8 9 30 31 22 23 24 25 26 7 8 9 30 31 20 31 32 33 4 5 6 7 8 9 10 11 20 21 22 22 24 25 26 7 8 9 30 31 32 33 4 5 6 7 8 9 10 11 20 21 22 22 24 25 26 7 8 9 30 31 32 33 33 33 33 33 33 34 35 6 37 8 9 0 11 22 23 24 25 26 7 28 9 30 31 22 23 24 25 26 7 28 9 30 31 22 23 24 25 26 7 28 9 30 31 22 23 24 25 26 7 28 9 30 31 22 33 34 35 36 37 38 9 0 41 22 23 24 25 26 7 28 9 30 31 22 33 34 35 36 37 38 9 0 41 22 23 24 25 26 27 28 9 30 31 22 33 34 35 36 37 38 9 0 41 22 33 34 35 36 37 38 9 0 41 22 33 34 35 36 37 37 37 37 37 37 37 37 37 37 37 37 37	collection process		piloting forms, done independently, in duplicate), any processes for obtaining and confirming data from investigators	
	Data items	<u>#12</u>	List and define all variables for which data will be sought (such as PICO items, funding sources), any pre-planned data assumptions and simplifications	2
	Outcomes and prioritization	<u>#13</u>	List and define all outcomes for which data will be sought, including prioritization of main and additional outcomes, with rationale	2
	Risk of bias in individual studies	<u>#14</u>	Describe anticipated methods for assessing risk of bias of individual studies, including whether this will be done at the outcome or study level, or both; state how this information will be used in data synthesis	3
	Data synthesis	<u>#15a</u>	Describe criteria under which study data will be quantitatively synthesised	4
	Data synthesis	<u>#15b</u>	If data are appropriate for quantitative synthesis, describe planned summary measures, methods of handling data and methods of combining data from studies, including any planned exploration of consistency (such as I2, Kendall's $\tau$ )	4
	Data synthesis	<u>#15c</u>	Describe any proposed additional analyses (such as sensitivity or subgroup analyses, meta-regression)	n/a
	Data synthesis	<u>#15d</u>	If quantitative synthesis is not appropriate, describe the type of summary planned	4
	Meta-bias(es)	<u>#16</u>	Specify any planned assessment of meta-bias(es) (such as publication bias across studies, selective reporting within studies)	4
	Confidence in cumulative evidence	<u>#17</u>	Describe how the strength of the body of evidence will be assessed (such as GRADE)	n/a
45 46 47 48 49 50 51 52 53 54 55 56 57 58	Attribution License C	C-BY.	and explanation paper is distributed under the terms of the Creative Commons This checklist was completed on 09. September 2021 using (, a tool made by the <u>EQUATOR Network</u> in collaboration with <u>Penelope.ai</u>	
59 60		For pe	er review only - http://bmjopen.bmj.com/site/about/guidelines.xhtml	