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Automated detection of adverse drug events from older inpatients' electronic medical records using structured data mining and natural language processing

Name and address of responsible researcher at the University Hospital Zurich (USZ)

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Confirmation of the responsible researchers

With my signature I confirm that everything stated in this document is correct, and that the study will be conducted accordingly.

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Responsible researcher at USZ: Ni	cola Colic
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Coinvestigator (external collaborat	
	orincipal investigator of the study and of the SNF grant, n Sciences Pharmaceutiques cliniques, University Hospital
	ne. According to the governance plan submitted to the
	/aud, she is the responsible person who gives
•	lete certain tasks related to the project. The collaborators
in charge are: Dr. med Marie-Appick Le Pogam (he	ereafter "MALP"), MD, MPH, coinvestigator in charge of
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Background and aim

This project aims at the automated identification of adverse drug events induced by antithrombotics prescribed for inpatients aged 65 or older.

Origin of the data

The data were extracted from the clinical data warehouse of the clinical information system «KISIM» at the USZ. All data were routinely collected as part of usual daily care for the patients.

Inclusion criteria

- Patients aged ≥65
- A hospital admission between 01.01.2015-31.12.2016
- At least one antithrombotic drug prescription during each stay
- Hospital stays >24 h.

Exclusion criteria

Outpatients and patients aged <65. Patients without any anticoagulants prescribed.

Patient data from electronic health records

This project analyzes pseudonymized data (structured electronic health record data) and deidentified data (reports). The Cantonal Ethics Committee in Lausanne (project identifier 2018-00272) approved the study protocol for all involved hospitals (University Hospital Zurich, and hospitals in Lausanne, Geneva, and Baden). The real patient and admission identification numbers were extracted from the clinical data warehouse but were replaced by other identifiers. A key table is stored at the Research Data Service Center (RDSC) that could enable reestablishing the connection between the extracted datasets (pseudo-identifiers) and the patients' electronic health records. **The key table will not be sent to MALP, JP, or CC**.

Methods

A variety of computational techniques will be used to automatically identify adverse drug events induced by antithrombotics. Rule-based algorithms and machine learning are some of the techniques used.

Description of data

From the patient report database at USZ, approximately 18000 reports were extracted that match the criteria described above. These reports are extracted in JSON format, within which there are free text sections in which doctors note symptoms, consultations, diagnoses, procedures performed and drugs administered. Those free text sections average to 1500 words per report. The entire report, including some structured meta-information, has been deidentified according to HIPAA standard, replacing identifying information such as name, address, hospital unit etc. by placeholders.

Data protection

The anonymized data will be transferred to the external collaborators by means of the official USZ encrypted data transfer service "secure file transfer" (transfer.usz.ch). The data will always remain encrypted when stored outside of the hospital, and only the specified external collaborators will ever have access to the data with an appropriate password set by CC. This password will neither be shared within the research group nor with any other person, except for MALP and JP. No third party besides the USZ collaborators and the specified external collaborators, MALP, JP, and CC will ever have access to the data according to this document (any other use of the data requires another agreement). Any hardware used in this research project will remain inaccessible to the public (e.g. will be locked in an office).

The external collaborators shall only use the transferred data for the purpose agreed, i.e. the research project as described herein and is not allowed to transfer the data to a third party. In particular, the data must not be used for commercial purposes and no patents will be based on the data or evolve from the project.

Ethics and regulatory affairs

We refer to the approved study protocol (see appendix 1). The Cantonal Ethics Committee in Lausanne (project identifier 2018-00272) approved the study protocol for all involved hospitals (University Hospital Zurich, and hospitals in Lausanne, Geneva, and Baden).

Reporting obligations

This study was approved by the Cantonal Ethics Committee in Lausanne (project identifier 2018-00272) for all involved hospitals (University Hospital Zurich, and hospitals in Lausanne, Geneva, and Baden). The project is not submitted to any reporting obligation.