Prediction of Malaria with Machine Learning Algorithms : An experimental Study

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Abstract. Still today, Malaria remains one of the most feared diseases in Sub-Saharan Africa and especially in Senegal. This is mainly due to inappropriate medical care support coupled with an often late and error-prone diagnosis from the medical staff. In addition, largely used diagnostic standards such as the Rapid Diagnosis Test is not fully reliable. With the development and increasing adoption of automated tools in the health field, machine learning applications might help medical actors in their decision-making process. In this paper, we propose an experimental study of six machine learning algorithms for the prediction of Malaria in Senegal. These algorithms aim at predicting whether or not a given patient suffers from Malaria based on his signs and symptoms. The performance of the algorithms have been extensively tested and evaluated over real data sets about patients in Senegal that suffer or not from Malaria. The algorithms are evaluated using four criteria: accuracy, Recall, F-measure, Precision and Specificity. The research has shown that there is not necessarily a single best classification tool, but instead the best performing algorithm will depend on the dataset to be analysed

Keywords.

1. Introduction

Malaria, also known as *des marais* in French, is an infectious disease caused by a mosquito of the type *Plasmodium*. In its severe form, the disease can lead to *yellow skin*, *seizures*, *coma* or *death*. As a result, Malaria is now recognized and treated as a serious health problem worldwide by the World Health Organization (WHO), and particularly pandemic in Sub-Saharan Africa. In 2018, an estimated 228 million cases of Malaria occurred worldwide, thanks to the 2019 World Malaria Report [?]. Most Malaria cases in 2018 were in the WHO African Region (213 million or 93%). In the special case of Senegal the problem is acute because of the use of inappropriate care support means coupled with an often late and error-prone diagnostic from the local medical staff. Setting up a reliable way to predict the disease when a patient visits a doctor become then crucial in order to avoid its evolution towards a critical state.

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Over the past years, many efforts have been done by governmental and non governmental organizations to eradicate Malaria: actions continuously conducted by the WHO are real examples of those. In the research field, many studies, aiming at understanding the disease from the Plasmodium mosquito point of view or proposing automated detection tools, have been conducted [?,?,?,?]. The Rapid Diagnostic Test (RDT) [?] is one of the most successful and prominent introduced tool to automatically predict whether or not a given patient suffers from Malaria. It relies on the detection of specific Plasmodium proteins, PfHRP2, pLDH and aldolase. The RDT is largely used and adopted as a standard in many health structures in Sub-African countries because of its simplicity to utilize and does not require any specific domain knowledge. However as highlighted in [?] the RDT is not fully reliable: in Section ?? we show that the precision of the RDT is about 90% for the real datasets used in this study. With the development and increasing adoption of automated tools in the health field, machine learning (ML) [?,?] applications might help medical actors in their decision-making process. There are already some attempts to apply ML techniques for the prediction or a better understanding of various diseases, e.g. [?,?]. For example, machine learning is used to analyze blood data obtained from high definition microscopic screenshots in [?]. On the other hand, logistic regression has been tested in [?] for the prediction of Malaria and provides promising results. In this paper, we propose an extensive comparative study of six machine learning algorithms, among the most popular for the prediction of Maria in Senegal. The evaluated and compared ML algorithms are Naive Bayes (NB) [?], Logistic Regression (LR) [?], Decision Tree (DT) [?], Support Vector Machine (SVM) [?], Random Forest (RF) [?], and Artificial Neural Network (ANN) [?]. Whereas the four first algorithms are simple models, the two last ones are built on more complex learning strategies. RF is an ensembling model and ANN performs Deep Learning. We conducted experiments on five datasets based on the two real world datasets about Senegalese citizens that suffer or not from Malaria. These two datasets have been collected in two different contexts and contain clinical data such as sign, symptom and final diagnostic of patients living in distinct locations in Senegal (for the first dataset) or within the same area (for the second dataset). Those patients have been examined by doctors in given health services and their clinical data recorded: for each patient the final diagnostic is provided with the corresponding signs and symptoms. The outcome of the RDT is also provided. To evaluate the performance of every considered algorithm we have considered common measures of the accuracy of a prediction system that are Precision, Recall, F1-score, True Positive Rate, and False Positive Rate on both datasets augmented with semi-synthetic datasets which are obtained after imputation in order to deal with missing values.

Our main result is that RF, SVM with Gaussian Kernel and ANN are promising and offer the best overall accuracy to predict the appearance or not of the disease with precision, recall and F1-score at least equal to 92%, 85% and 89% respectively on both datasets. More specifically, those three learning approaches outperform the RDT which represents the baseline automatic diagnostic tool largely adopted as a standard within the Health system in Senegal.

The rest of the paper is structured as follows. First we gives detail explanation of machine learning methods and the different data sets methods used for this study in section 2. In section 3 our differents results are presented. Section 4 and 5 includes discussion of our results and conclusions of this paper.

References