

UNIVERSITI TEKNOLOGI MARA

**PREDICTION OF NOVEL DOPING AGENT
THROUGH THE INTEGRATION OF
CHEMICAL AND BIOLOGICAL DATA USING
IN SILICO METHOD**

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ABSTRACT

The identification of novel doping agent is not quick enough to prevent the misused of the potential doping agent among athletes. Existing techniques e.g. HPLC are costly and time consuming. Hence, other alternative methods are needed to handle this problem and one such method is *in silico* method. In this study, an *in silico* method that integrates chemical and biological data was used to predict potential doping agents. The *in silico* method, also known as *in silico* target prediction, first analyse patterns of protein-ligand binding from chemical and biological data through the use of machine learning algorithm. The deductive model built can then be used to predict potential protein targets for a novel compound, given its chemical structure. The models built were trained on compounds binding to protein targets known to produce doping effects e.g. androgen receptor which increases muscle mass obtained from ChEMBL database. This study employed three molecular descriptors (MACCS Keys, ECFP_4 and FCFP_4) and two machine learning algorithms (Decision Tree and Naive Bayes Classifier) to build the predictive model. Two validations were performed on the models which are internal and external validation. Sensitivity was used as a performance measure. The performance of the models were also analysed at a certain cut off scores and ranks. The internal validation showed that the combination of FCFP_4 and Decision Tree model performed best with a sensitivity value of 0.94 , when a cut off of rank 5 was applied. This model then proceeded to the external where compounds from WADA Monitoring List were subjected to testing. It was found that mitragynine and nicotine were predicted to bind to κ -opioid receptor which is supported by scientific literature. This proved that the model was able to predict the protein target for compound outside of the training set. Hence, *in silico* method can be used to predict potential doping agents in a timely and efficient manner and consequently prevent the widespread of misused of doping agent.

CHAPTER 1

INTRODUCTION

1.1 Problem Statement

The identification of novel doping agent is not quick enough to prevent the misuse of the potential doping agent.

1.2 Hypothesis of the Study

Novel doping agents can be predicted through the use of *in silico* methods that incorporate chemical and biological data.

1.3 Objective of the Study

To build an *in silico* target prediction that can analyse the patterns of protein-ligand binding of doping agents and consequently predict novel doping agents based on its chemical structure.

1.4 Significant and Limitation of Study

Significant of this study is the novel doping agent can be predicted before the compound is misuse and abuse by the user. Limitation of this study is that the prediction of novel doping is based on the training set used. Hence, the accuracy of prediction beyond the training space cannot be guaranteed.