PPSNV:A novel predictor for pathogenicity of SNV based on ensemble learning

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1. Introduction

With the next-generation sequencing (NGS) technologies developing and personalized medicine applied, it is practical for doctors to conduct genetic testing in clinical diagnosis. Among numerous output data of genome sequencing, nonsynonymous single nucleotide variant(SNV) is a common type of genetic variants which probably cause disease. However, to identify the pathogenicity of a specific SNV by experiment is costly and time-consuming which call for computational methods the classification of SNVs. Consequence of a genetic variant in vivo veils behind complex biological mechanisms. Discriminating a SNV is pathogenic accurately remains challenging.

Good or Bad, it is a question. To answer the question, many tools are developed to predict the pathogenicity of genetic variants.

Ensemble learning is proved to obtain advantages from its base learners and it is already adopted to assess the pathogenicity of variants.

1. methods
   1. Gradient Boosting Decision Tree(GBDT)

Based on boosting strategy, Gradient Boosting Decision Tree(GBDT) is a method which outstands among other machine learning methods in the tasks of classification and regression. Some previous research works use GBDT to perform prediction in biological tasks and achieve best performance(Liao, Huang et al. 2016). Specially, GBDT is suitable for tabular and dense input data space which our data exists. Inspired by what mentioned above, we propose a framework based on GBDT to predict the pathogenicity of SNP.

We use LightGBM, an implementation and optimization of GBDT, to build our model.

* 1. Datasets

We use the dataset provided of a previous work, containing 5 subsets and 45081 variants which are collected from publicly available and commonly used benchmark datasets. All variants in the dataset are labeled and the variants overlapping with CADD training data are removed. After removing overlapping variants between 5 subsets, *HumVar, ExoVar, VariBenchSelected, predictSNPSelected* are merged into a new dataset which we use to train our model. As for *SwissVarSelected,* we leave it as an independent test dataset based on which we compare our proposed framework with other methods.

The details of our datasets are listed below.

* 1. Training

Since PPSNV is based on the open-source software library, LightGBM which provides python implementation, we tune the hyperparameters of our classifier, such as the learning rate and the max depth of trees using Scikit-learn(Scikit-learn: Machine Learning in Python, Pedregosa et al., JMLR 12, pp. 2825-2830, 2011.) . Besides, we adopt an early stopping strategy to avoid over-fitting. Our proposed model is trained by maximizing the AUC for binary pathogenicity classification.

* 1. Features

We include 16 features in total to train PPSNV. Predictive features included can be divided into two parts, one of which is 6 basic features of SNV(chromosome, location, reference allele, alternate allele, reference amino acid, alternate amino acid) and others are pathogenicity predictions scores from 10 existing tools(SIFT, Polyphen2\_HDIV, Polyphen2\_HVAR, LRT, MutationTaster, MutationAssessor, FATHMM, RadialSVM, VEST3, CADD). All features are obtained from Annovar. Missing features are not imputed since our model is rubost to handle some missing values in input features. Besides, tolerating missing input is suitable for practical prediction because many SNVs are annotated by existing prediction tools but some tools do not return valid result.

* 1. Testing
  2. Comparators

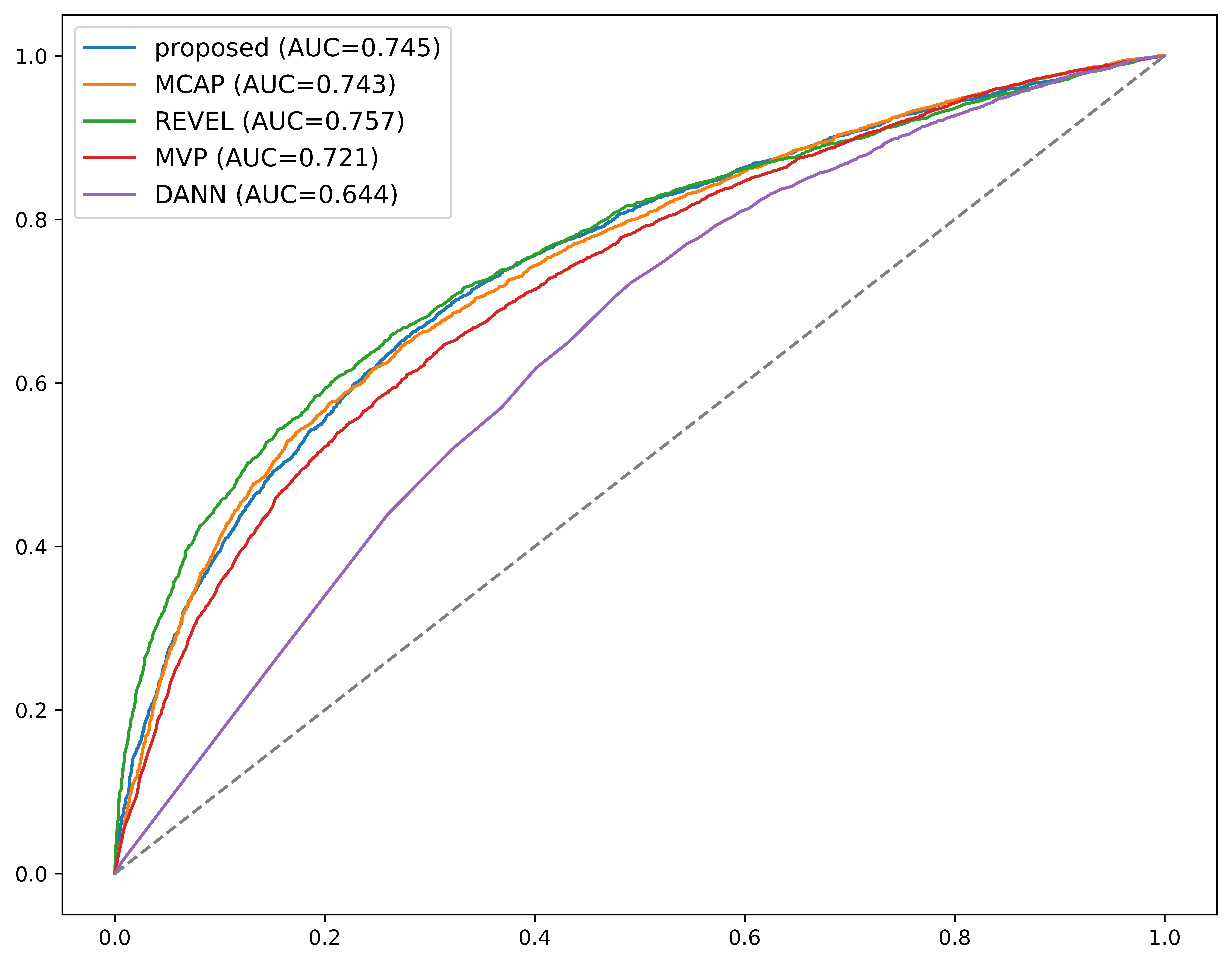
PPSNV are compared with four predictions tools that are commonly used and readily implemented：M-CAP, REVEL, MVP, DANN which are all ensemble prediction tools. The results of these tools are obtained by Annovar and the SNVSs in our test dataset with missing values are removed. Considering that several compared tools return pathogenic scores instead of binary classification results and the thresholds recommended to decide a SNV pathogenic or not may be not optimal in our research, we apply receiver operating characteristic(ROC) curves, the area under the ROC curve(AUC) and precision-recall (PR) curve to assess the overall performance of six predictors including the proposed accurately.

1. RESULT
   1. Characterization of Features

The PPSNV ensemble the pathogenic predictions of 10 individual tools as features besides 6 basic properties of SNV. The importance of a feature in PPSNP reflects how the feature contributes to the final prediction result. The top five important features in our model are VEST3, FATHMM, CADD, MutationAssessor, RadialSVM. Compared with the basic features, features from ensemble tools earn much higher importance which indicates the prediction scores of existing tools represents more intrinsic information.

* 1. Performance of PPSNV compared with other methods

The PPSNV performs well in the test with an AUC of 0.745, which surpasses M-CAP, MVP and DANN. However, its performance is slightly worse than the performance of REVEL. Considering that REVEL ensembles 18 individual pathogenicity prediction score, PPSNV is a lightweight model.



1. DISCUSSION

Aiming to predict the pathogenicity of genetic variants accurately, there are many methods which base on different biological mechanism.

1. Citing Related Work

This section cites a variety of journal [5, 15], conference [1, 6, 8, 12, 13], and magazine [3] articles to illustrate how they appear in the references section. It also cites books [9, 10], a technical report [7], a PhD dissertation [4], an online reference [14], a software artifact [11], and a dataset [2].

ACKNOWLEDGMENTS

Acknowledgments are placed before the references. Add information about grants, awards, or other types of funding that you have received to support your research. Author can capture the **grant sponsor information**, by selecting the grant sponsor text and apply style ‘GrantSponsor’. After this, select grant no and apply ‘GrantNumber’ from style panel. Example of Grant sponsor: Competitive Research Programme and example of Grant no: CRP 10-2012-03.

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A  APPENDICES

In the appendix section, three levels of Appendix headings are available.

A.1 General Guidelines (AppendixH2)

1. Save as you go and backup your file regularly.
2. Do not work on files that are saved in a cloud directory. To avoid problems such as MS Word crashing, please only work on files that are saved locally on your machine.
3. Equations should be created with the built-in Microsoft® Equation Editor included with your version of Word. (Please check the compatibility at <http://tinyurl.com/lzny753> for using MathType.)
4. Please save all files in DOCX format, as the DOC format is only supported for the Mac 2011 version.
5. Tables should be created with Word’s “Insert Table” tool and placed within your document. (Tables created with spaces or tabs will have problems being properly typeset. To ensure your table is published correctly, Word’s table tool must be used.)
6. Do not copy-and-paste elements into the submission document from Excel such as charts and tables.
7. Footnotes should be inserted using Word’s “Insert Footnote” feature.
8. Do not use Word’s “Insert Shape” function to create diagrams, etc.
9. Do not have references appear in a table/cells format as it will produce an error during the layout generation process.
10. MS Word does not consistently allow the original formatting to be modified in the text. In these cases, it is best to copy all the document’s text from the specific file and paste into a new MS Word document and then save it.
11. At times there are font problems such as “odd” stuff/junk characters that appear in the text, usually in the references. This can be caused by a variety of reasons such as copying-and-pasting from another file, file transfers, etc. Please review your text prior to submission to make sure it reads correctly.

A.1.1 Preparing Graphics (AppendixH3)

1. Accepted image file formats: TIFF (.tif), JPEG (.jpg).
2. Scalable vector formats (i.e., SVG, EPS and PS) are greatly preferred.
3. Application files (e.g., Corel Draw, MS Word, MS Excel, PPT, etc.) are NOT recommended.
4. Images created in Microsoft Word using text-box, shapes, clip-art are NOT recommended.
5. IMPORTANT: All fonts must be embedded in your figure files.
6. Set the correct orientation for each graphics file.

A.2 Placeholder Text

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Liao, Z., et al. (2016). "<i>In Silico</i> Prediction of Gamma-Aminobutyric Acid Type-A Receptors Using Novel Machine-Learning-Based SVM and GBDT Approaches." BioMed Research International **2016**: 2375268.

Gamma-aminobutyric acid type-A receptors (<inline-formula><mml:math xmlns:mml="<http://www.w3.org/1998/Math/MathML>" id="M1"><mml:msub><mml:mrow><mml:mi mathvariant="normal">G</mml:mi><mml:mi mathvariant="normal">A</mml:mi><mml:mi mathvariant="normal">B</mml:mi><mml:mi mathvariant="normal">A</mml:mi></mml:mrow><mml:mrow><mml:mi mathvariant="normal">A</mml:mi></mml:mrow></mml:msub><mml:mi mathvariant="normal">R</mml:mi></mml:math></inline-formula>s) belong to multisubunit membrane spanning ligand-gated ion channels (LGICs) which act as the principal mediators of rapid inhibitory synaptic transmission in the human brain. Therefore, the category prediction of <inline-formula><mml:math xmlns:mml="<http://www.w3.org/1998/Math/MathML>" id="M2"><mml:msub><mml:mrow><mml:mi mathvariant="normal">G</mml:mi><mml:mi mathvariant="normal">A</mml:mi><mml:mi mathvariant="normal">B</mml:mi><mml:mi mathvariant="normal">A</mml:mi></mml:mrow><mml:mrow><mml:mi mathvariant="normal">A</mml:mi></mml:mrow></mml:msub><mml:mi mathvariant="normal">R</mml:mi></mml:math></inline-formula>s just from the protein amino acid sequence would be very helpful for the recognition and research of novel receptors. Based on the proteins&#x2019; physicochemical properties, amino acids composition and position, a <inline-formula><mml:math xmlns:mml="<http://www.w3.org/1998/Math/MathML>" id="M3"><mml:msub><mml:mrow><mml:mi mathvariant="normal">G</mml:mi><mml:mi mathvariant="normal">A</mml:mi><mml:mi mathvariant="normal">B</mml:mi><mml:mi mathvariant="normal">A</mml:mi></mml:mrow><mml:mrow><mml:mi mathvariant="normal">A</mml:mi></mml:mrow></mml:msub><mml:mi mathvariant="normal">R</mml:mi></mml:math></inline-formula> classifier was first constructed using a 188-dimensional (188D) algorithm at 90&#x25; cd-hit identity and compared with pseudo-amino acid composition (PseAAC) and ProtrWeb web-based algorithms for human <inline-formula><mml:math xmlns:mml="<http://www.w3.org/1998/Math/MathML>" id="M4"><mml:msub><mml:mrow><mml:mi mathvariant="normal">G</mml:mi><mml:mi mathvariant="normal">A</mml:mi><mml:mi mathvariant="normal">B</mml:mi><mml:mi mathvariant="normal">A</mml:mi></mml:mrow><mml:mrow><mml:mi mathvariant="normal">A</mml:mi></mml:mrow></mml:msub><mml:mi mathvariant="normal">R</mml:mi></mml:math></inline-formula> proteins. Then, four classifiers including gradient boosting decision tree (GBDT), random forest (RF), a library for support vector machine (libSVM), and k-nearest neighbor (<inline-formula><mml:math xmlns:mml="<http://www.w3.org/1998/Math/MathML>" id="M5"><mml:mrow><mml:mi>k</mml:mi></mml:mrow></mml:math></inline-formula>-NN) were compared on the dataset at cd-hit 40&#x25; low identity. This work obtained the highest correctly classified rate at 96.8&#x25; and the highest specificity at 99.29&#x25;. But the values of sensitivity, accuracy, and Matthew&#x2019;s correlation coefficient were a little lower than those of PseAAC and ProtrWeb; GBDT and libSVM can make a little better performance than RF and <inline-formula><mml:math xmlns:mml="<http://www.w3.org/1998/Math/MathML>" id="M6"><mml:mrow><mml:mi>k</mml:mi></mml:mrow></mml:math></inline-formula>-NN at the second dataset. In conclusion, a <inline-formula><mml:math xmlns:mml="<http://www.w3.org/1998/Math/MathML>" id="M7"><mml:msub><mml:mrow><mml:mi mathvariant="normal">G</mml:mi><mml:mi mathvariant="normal">A</mml:mi><mml:mi mathvariant="normal">B</mml:mi><mml:mi mathvariant="normal">A</mml:mi></mml:mrow><mml:mrow><mml:mi mathvariant="normal">A</mml:mi></mml:mrow></mml:msub><mml:mi mathvariant="normal">R</mml:mi></mml:math></inline-formula> classifier was successfully constructed using only the protein sequence information.

1. \* Place the footnote text for the author (if applicable) here. [↑](#footnote-ref-1)