Machine Learning-based Prediction of Enzyme Substrate Scope: Application to Bacterial Nitrilases

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Abstract

Predicting the range of substrates accepted by an enzyme from its amino acid sequence is challenging. Although sequenceand structure-based annotation approaches are often accurate for predicting broad categories of substrate specificity, they
generally cannot predict which specific molecules will be accepted as substrates for a given enzyme, particularly within a class
of closely related molecules. Combining targeted experimental activity data with structural modeling, ligand docking, and
physicochemical properties of proteins and ligands with various machine learning models provides complementary information
that can lead to accurate predictions of substrate scope for related enzymes. Here we describe such an approach that can
predict the substrate scope of bacterial nitrilases, which catalyze the hydrolysis of nitrile compounds to the corresponding
carboxylic acids and ammonia. Each of the four machine learning models (linear regression, random forest, gradient-boosted
decision trees, and support vector machines) performed similarly (average ROC = 0.9, average accuracy = ~82%) for predicting
substrate scope for this dataset. The approach is intended to be highly modular with respect to physicochemical property
calculations and software used for docking and modeling.

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