

Representation of Features as Images with Neighborhood Dependencies for Compatibility with Convolutional Neural Networks

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Abstract

Deep learning with Convolutional Neural Networks has shown great promise in image-based classification and enhancement but is often unsuitable for predictive modeling using features without spatial correlations. We present a feature representation approach termed REFINED (REpresentation of Features as Images with NEighborhood Dependencies) to arrange high-dimensional vectors in a compact image form conducive for CNN-based deep learning. We consider the similarities between features to generate a concise feature map in the form of a two-dimensional image by minimizing the pairwise distance values following a Bayesian Metric Multidimensional Scaling Approach. We hypothesize that this approach enables embedded feature extraction and, integrated with CNN-based deep learning, can boost the predictive accuracy. We illustrate the superior predictive capabilities of the proposed framework as compared to state-of-the-art methodologies in drug sensitivity prediction scenarios using synthetic datasets, drug chemical descriptors as predictors from NCI60, and both transcriptomic information and drug descriptors as predictors from GDSC. Code: <https://github.com/omidbazgirTTU/REFINED> Full Paper: <https://www.nature.com/articles/s41467-020-18197-y>

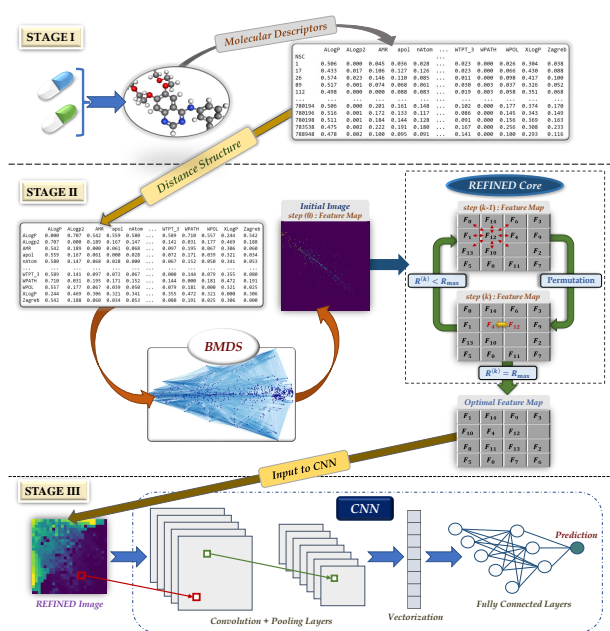


Figure 1. Overview of REFINED-CNN methodology for a representative application of drug sensitivity prediction using high-dimensional input features, such as molecular descriptors of drugs or genomic profiles of cell lines. STAGE I, calculate the pairwise dissimilarity matrix for the input features (672×672 Euclidean distance matrix for PaDEL descriptors of 52,000 unique drugs in NCI60 here). STAGE II, apply BMDS on this distance matrix to generate an initial image (of size 26×26 here) and apply hill climbing to arrive at an optimal configuration, i.e., the REFINED image, by maximizing the similarity between initial and final dissimilarity matrices. STAGE III, train a suitable CNN architecture with the REFINED images and predict sensitivity for a new sample (a given drug here)

1. Paper Summary

References

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