

# D-GF-CNN Algorithm for Modulation Recognition

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## Research Article

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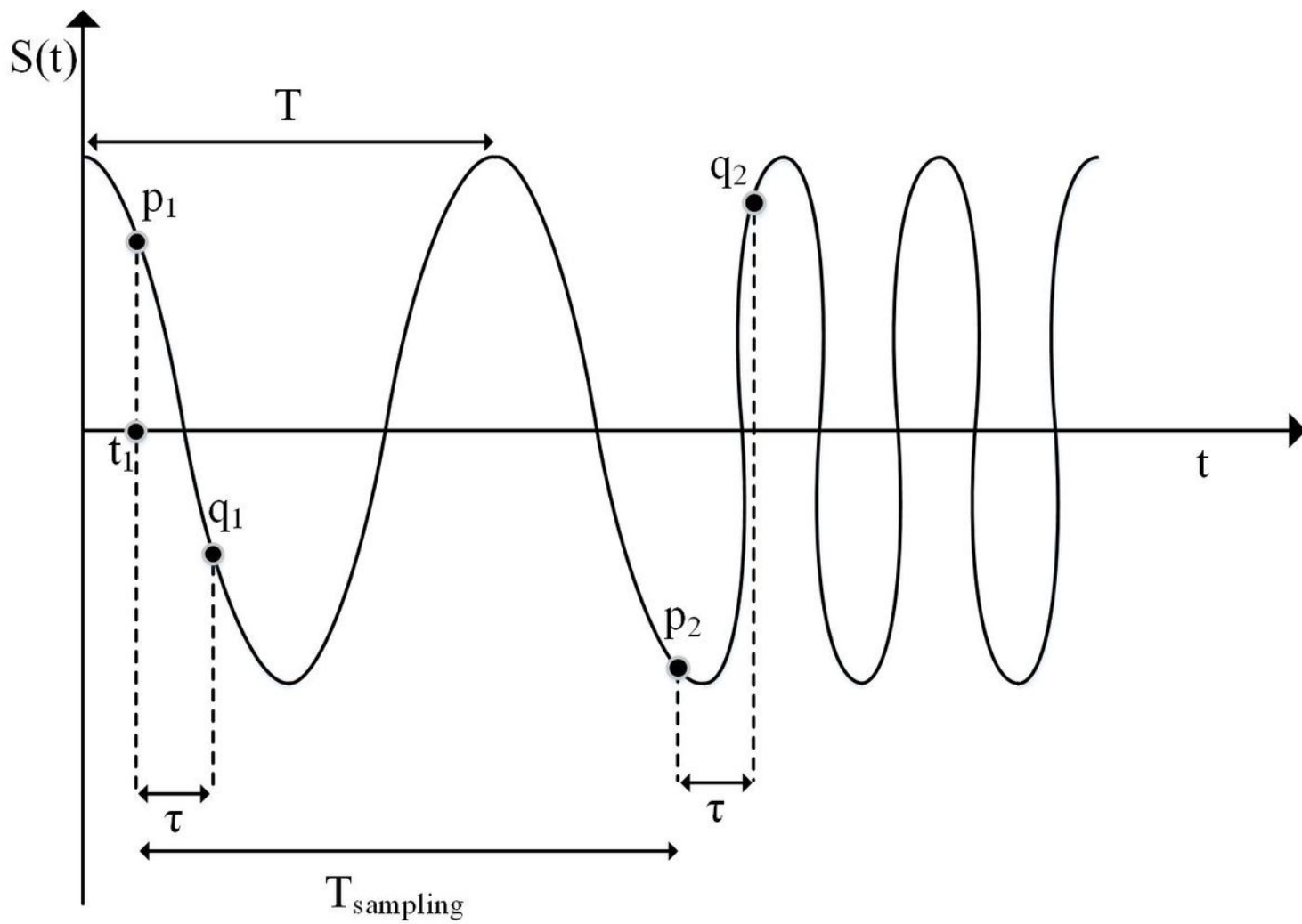
## Abstract

This paper presents a novel modulation recognition algorithm based D-GF convolutional neural networks, named as D-GF-CNN algorithm. Firstly, a asynchronous delay sampling (ADS) technique is introduced. Via the defined ADS, the received signal is converted into asynchronous delay histogram (ADH). The ADH of different modulation signal has distinct characteristics, which provides great convenience for the neural network to identify the modulation mode. Then, the pixel point matrix of histogram is convolved with the dilated convolution kernel of the convolutional neural network, and the automatic extraction of signal features is completed so that the manual feature extraction processing can be effectively avoid. According to the optimization theory, a novel GF regularization function is given, which can improve the constraint ability of the loss function on the weight and effectively weaken the influence of network over-fitting on the modulation recognition accuracy. Theoretical analysis and simulation experiments show that the proposed algorithm can offer several advantages, such as automatically extract features, effectively prevent network over-fitting and improve recognition accuracy, etc.

## Full Text

Due to technical limitations, full-text HTML conversion of this manuscript could not be completed. However, the latest manuscript can be downloaded and [accessed as a PDF](#).

## Figures



**Figure 1**

Asynchronous delay sampling

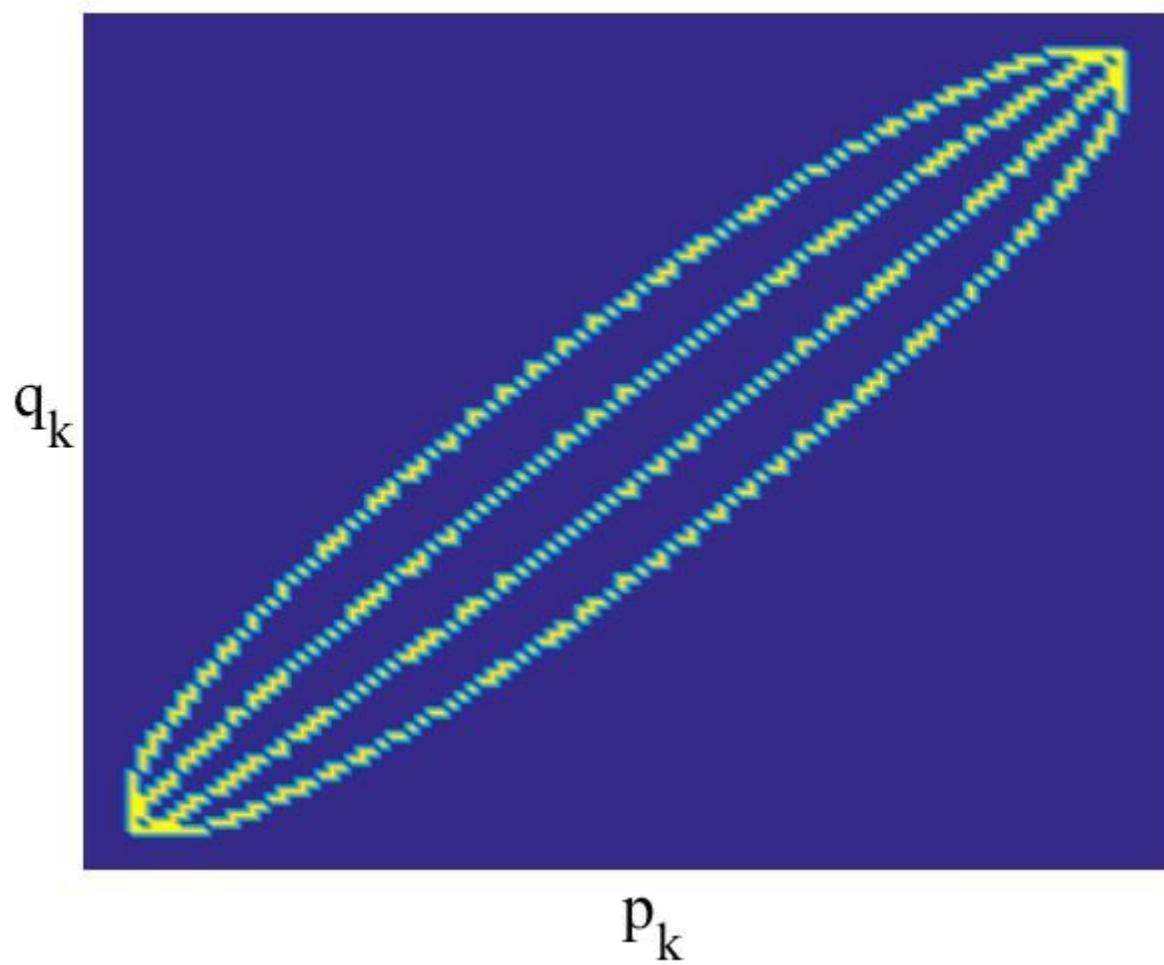


Figure 2

Asynchronous delay sampling of FSK

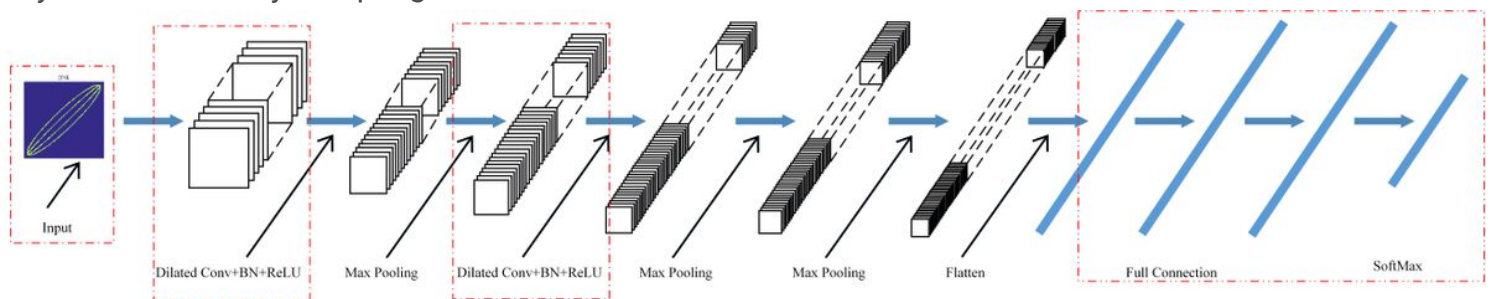
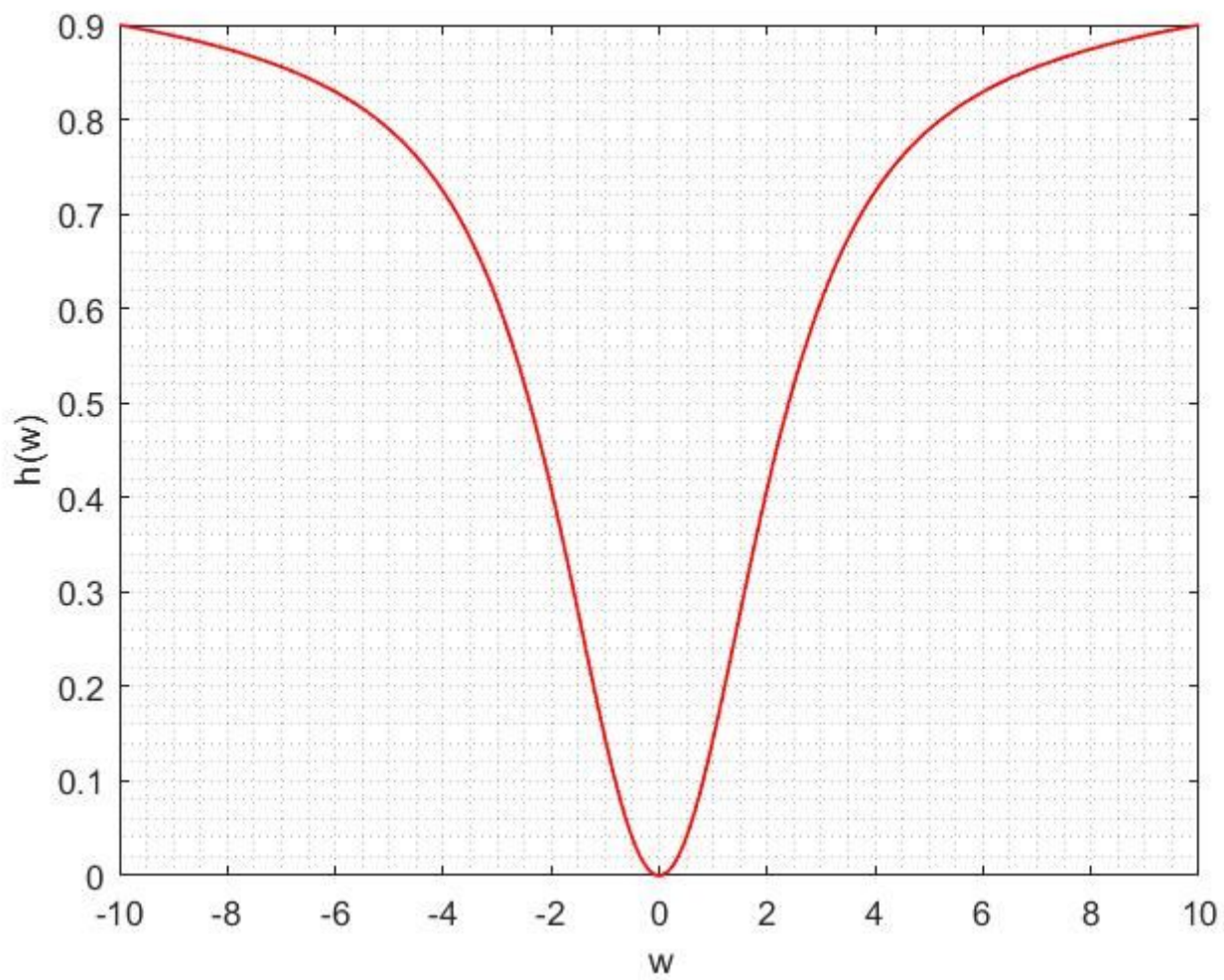


Figure 3

D-GF convolution neural network structure



**Figure 4**

$h(w)$

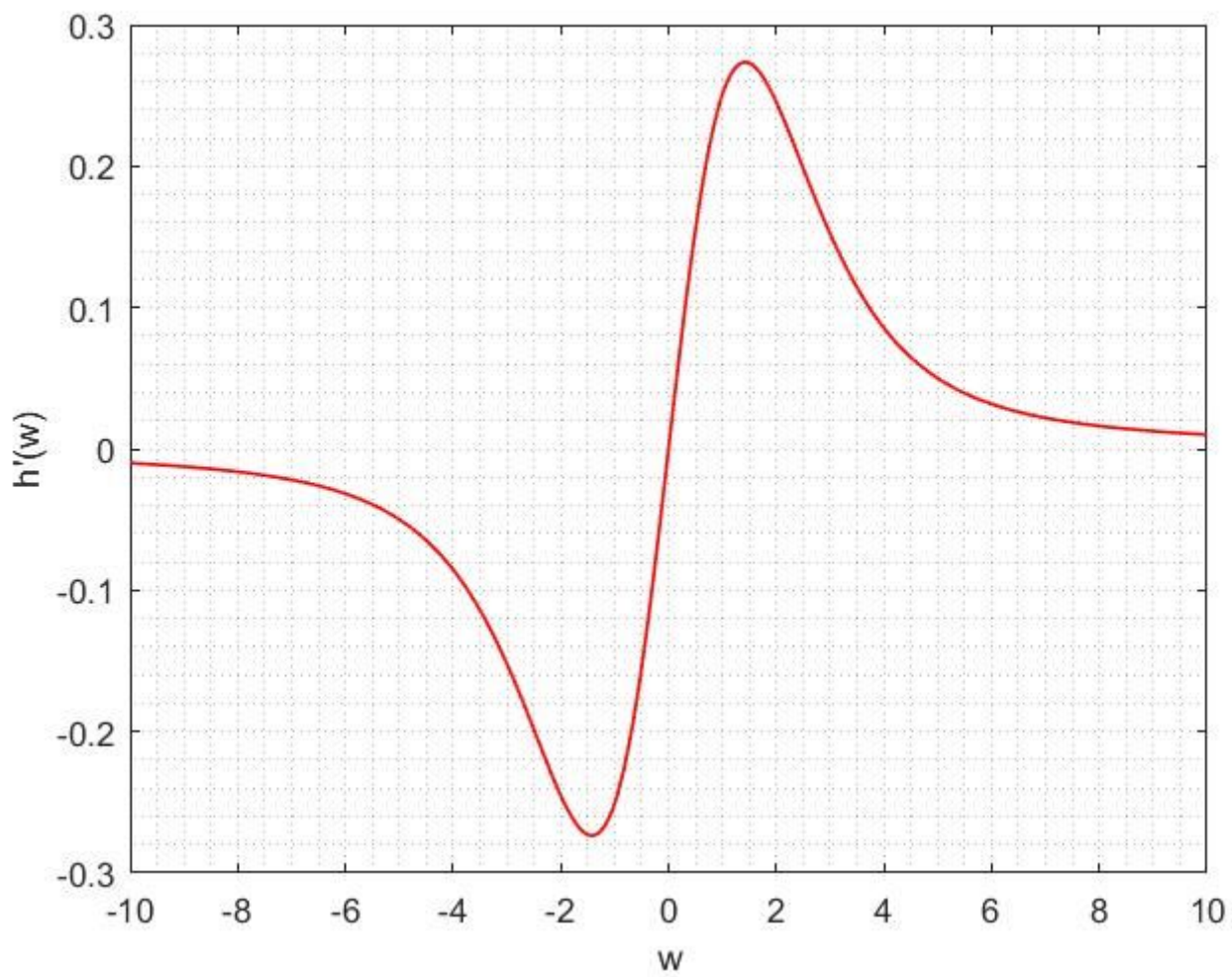


Figure 5

$h'(\omega)$

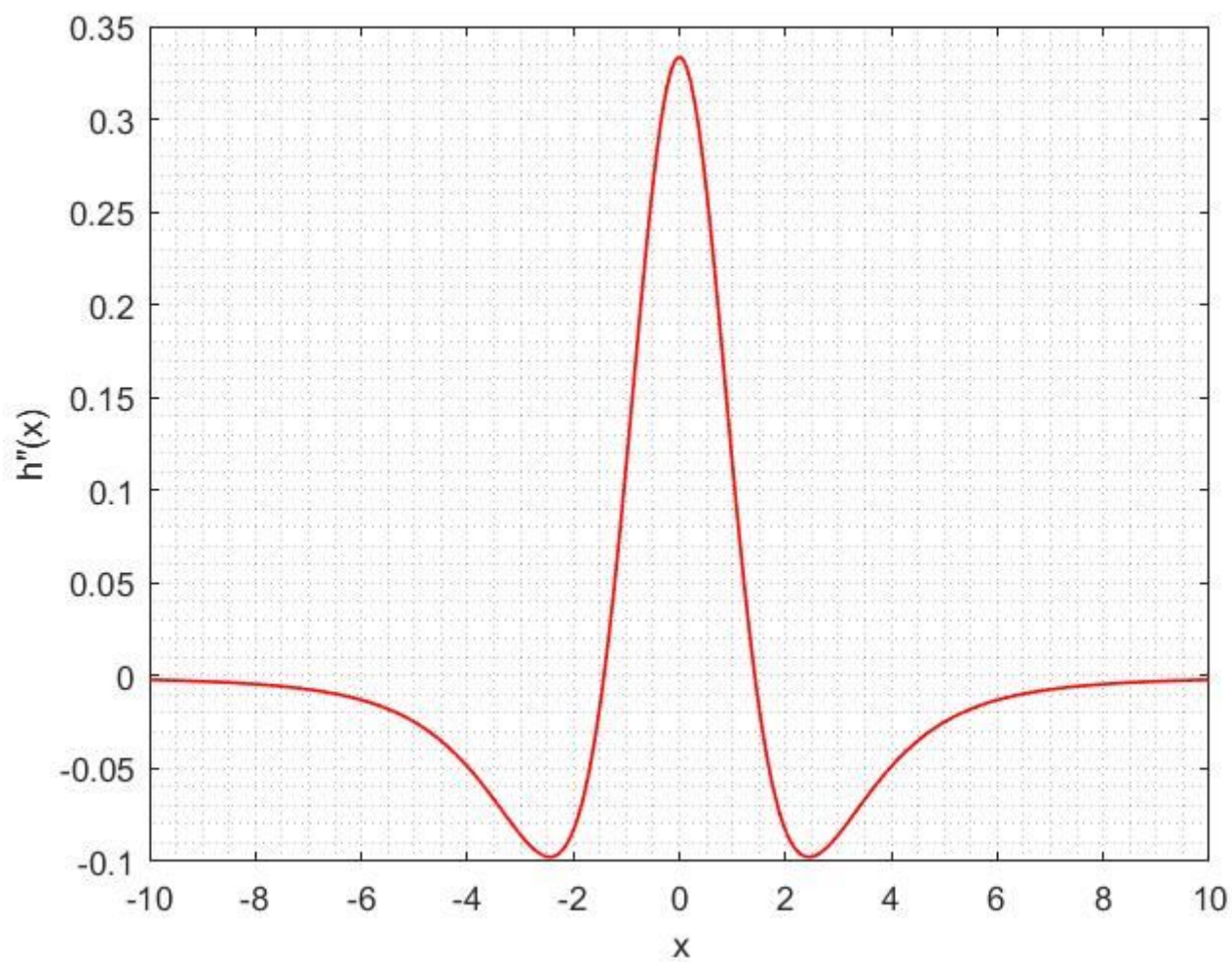
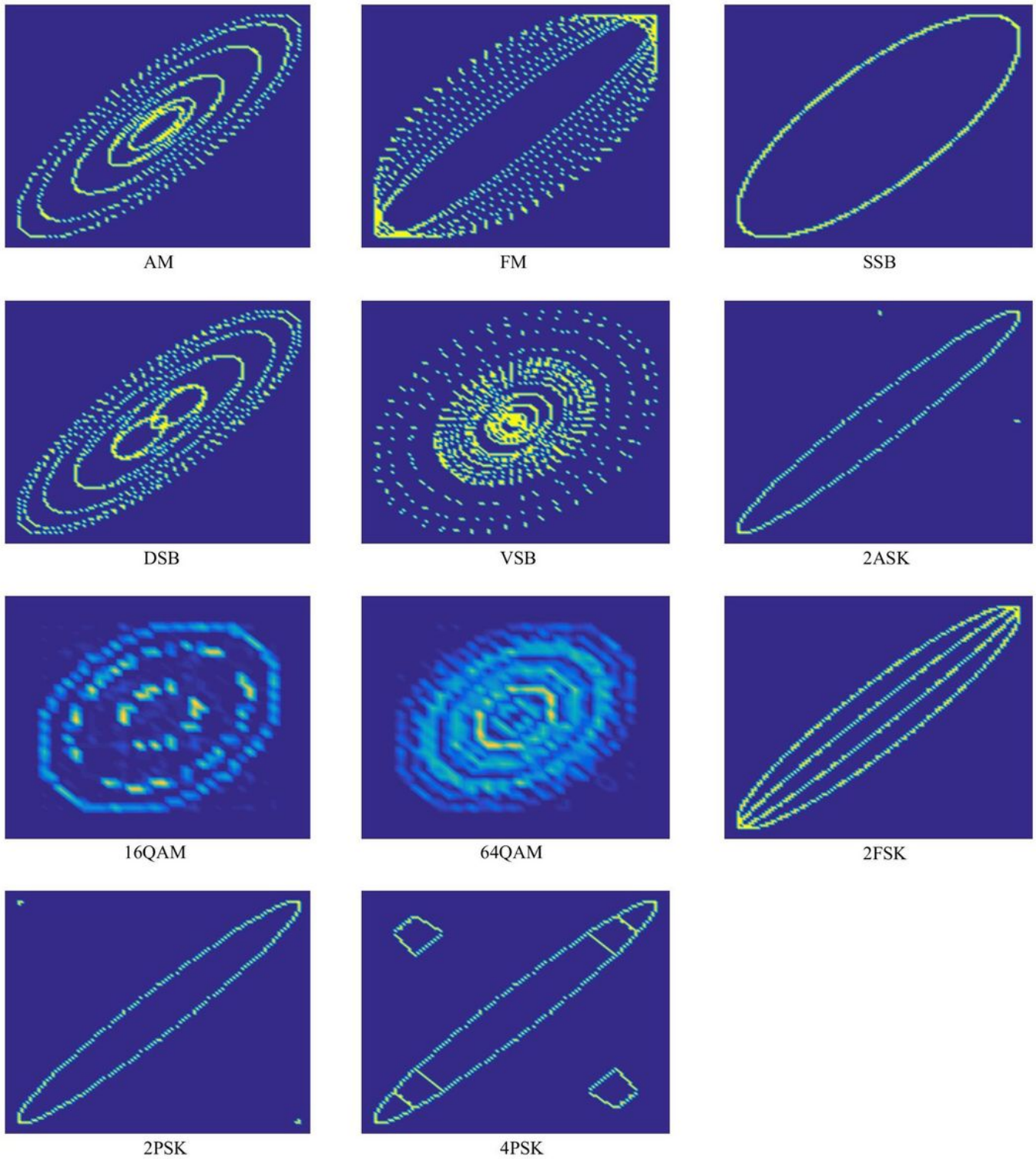


Figure 6

$h''(\omega)$

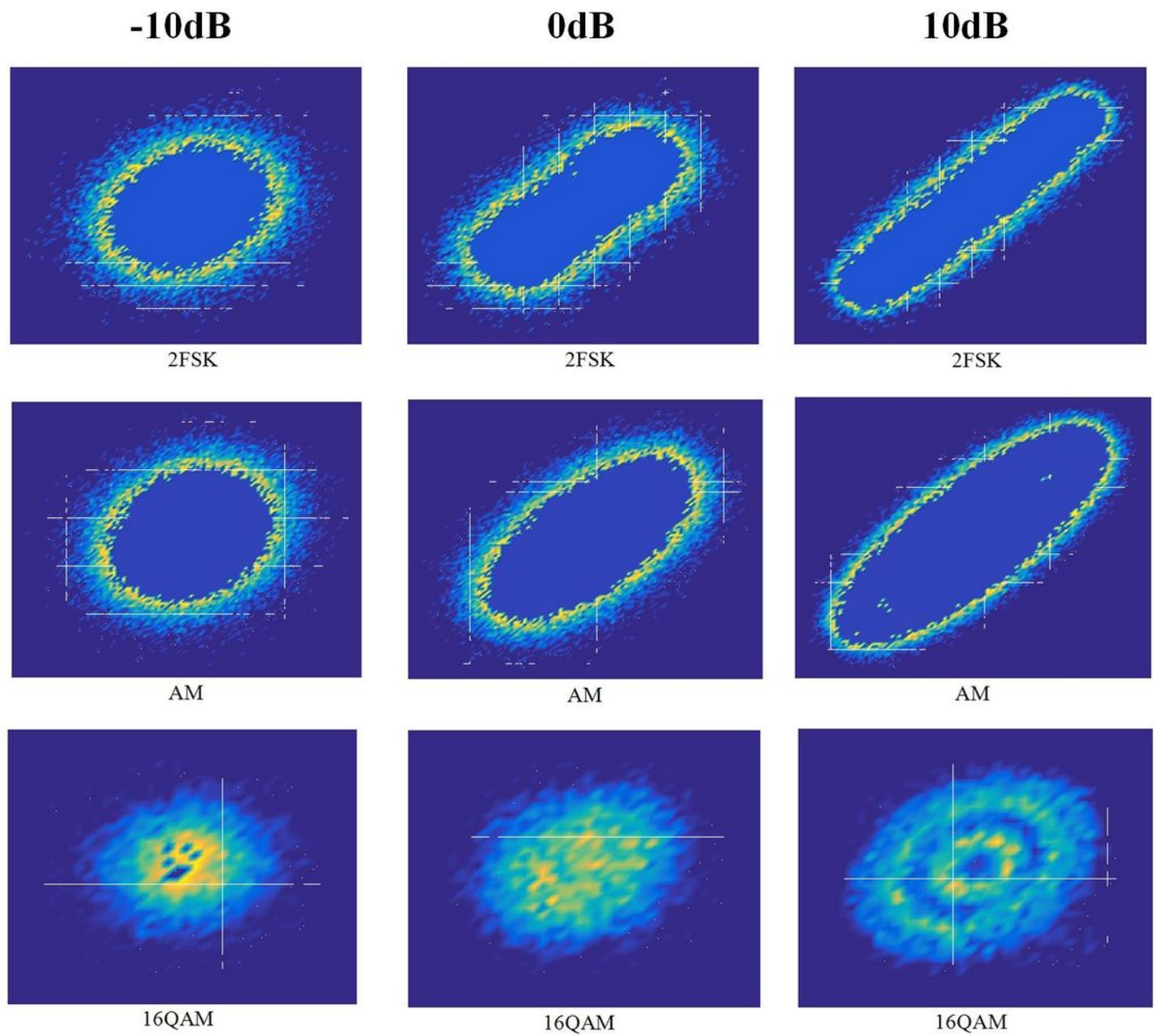




**Figure 7**

ADS Dataset





**Figure 8**

ADS histograms at different SNR

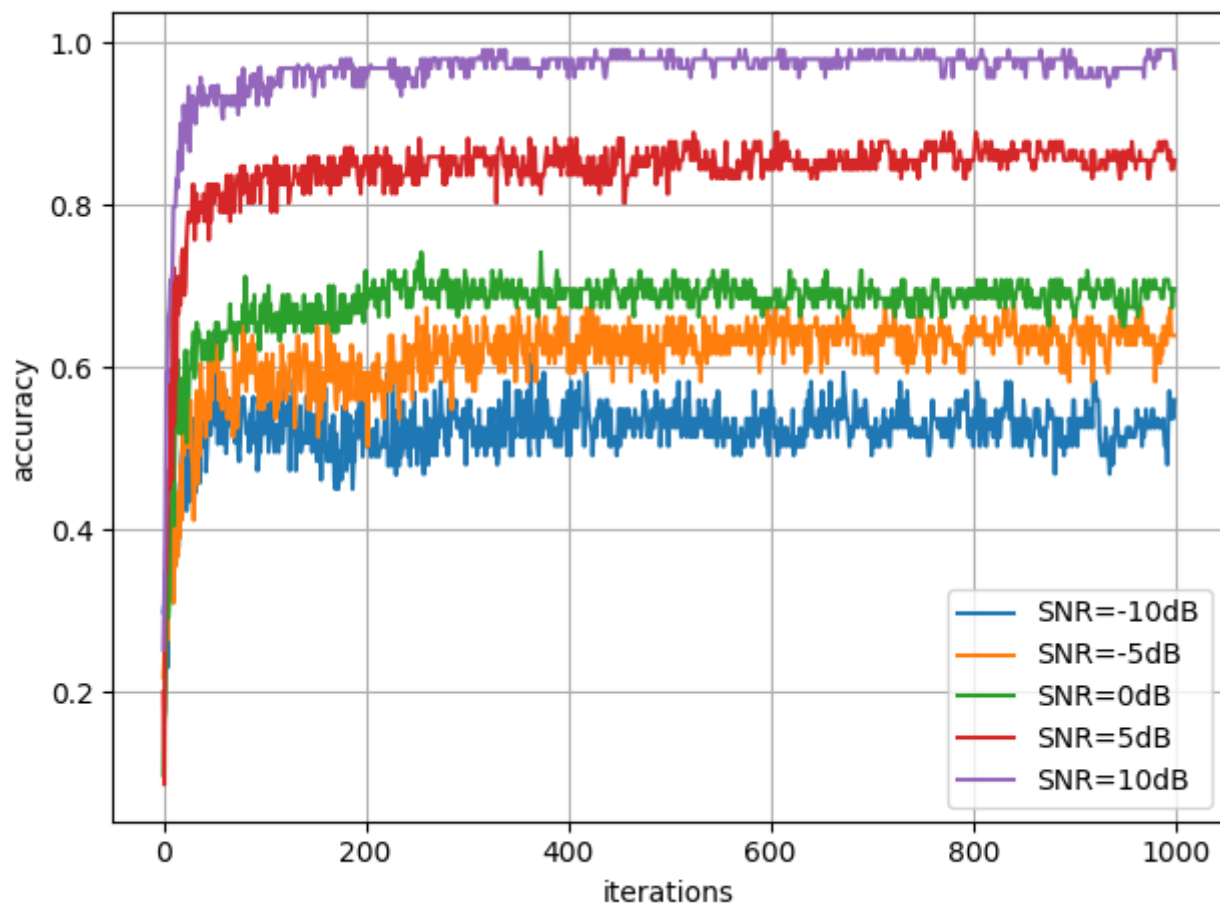


Figure 9

Validation curves of accuracy

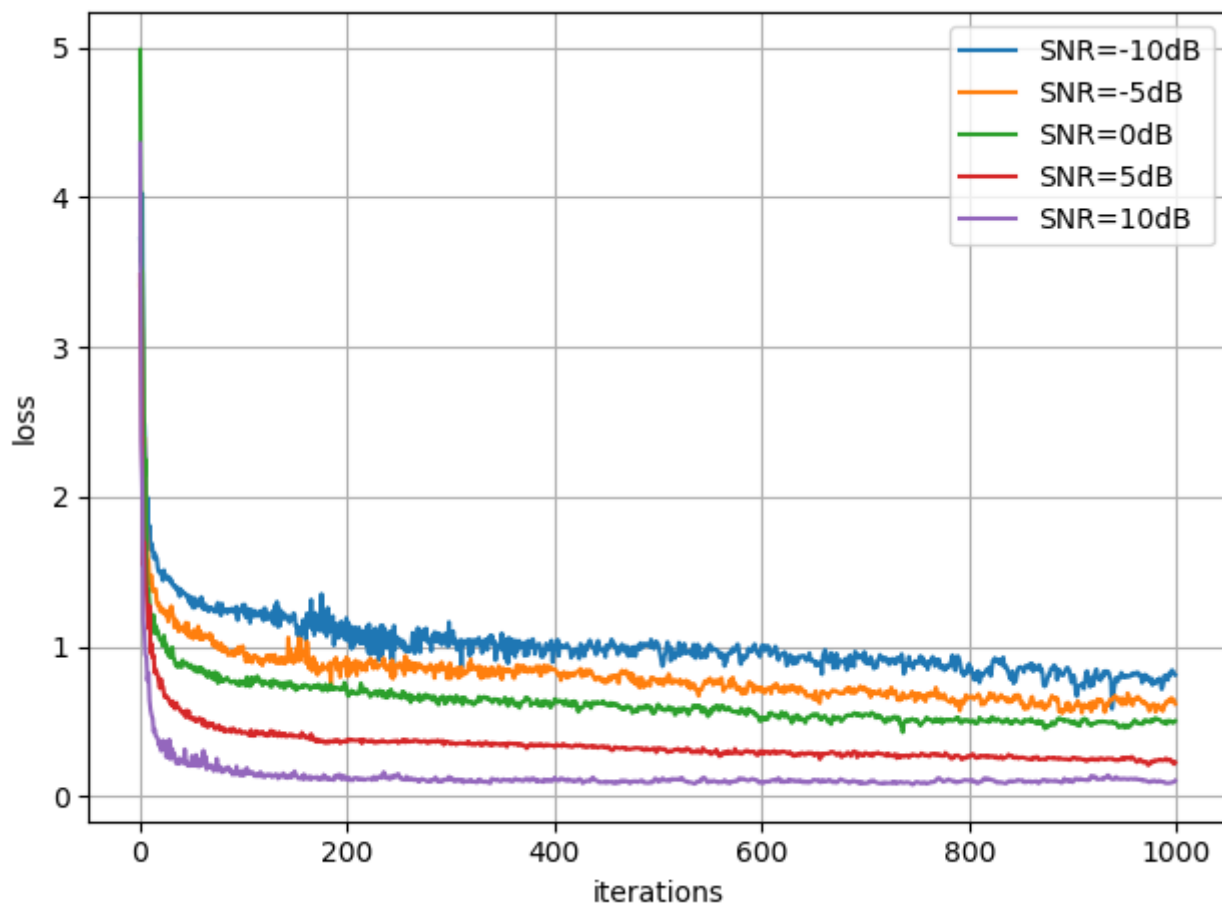
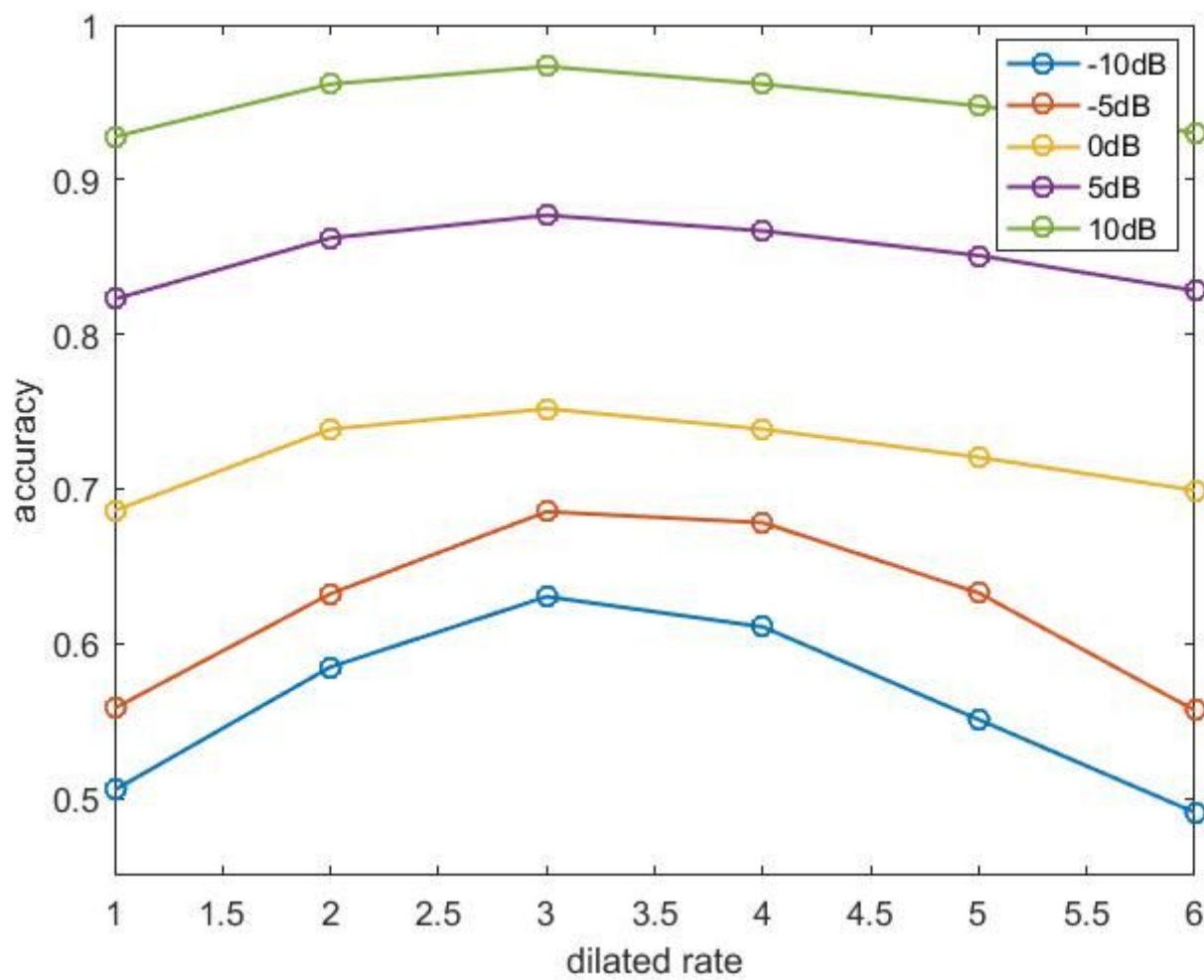


Figure 10

Validation curves of loss



**Figure 11**

Accuracy in different dilated rates

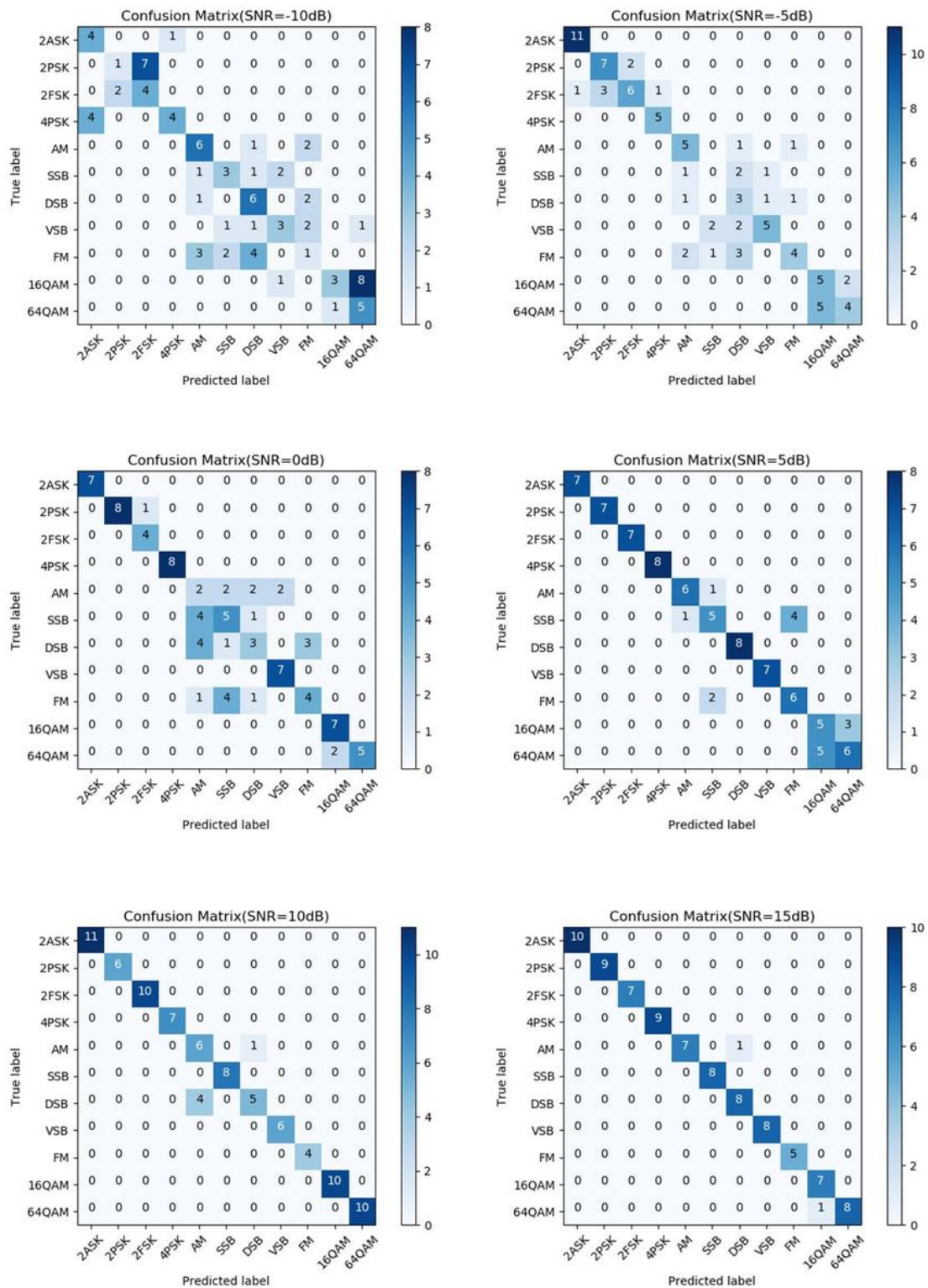
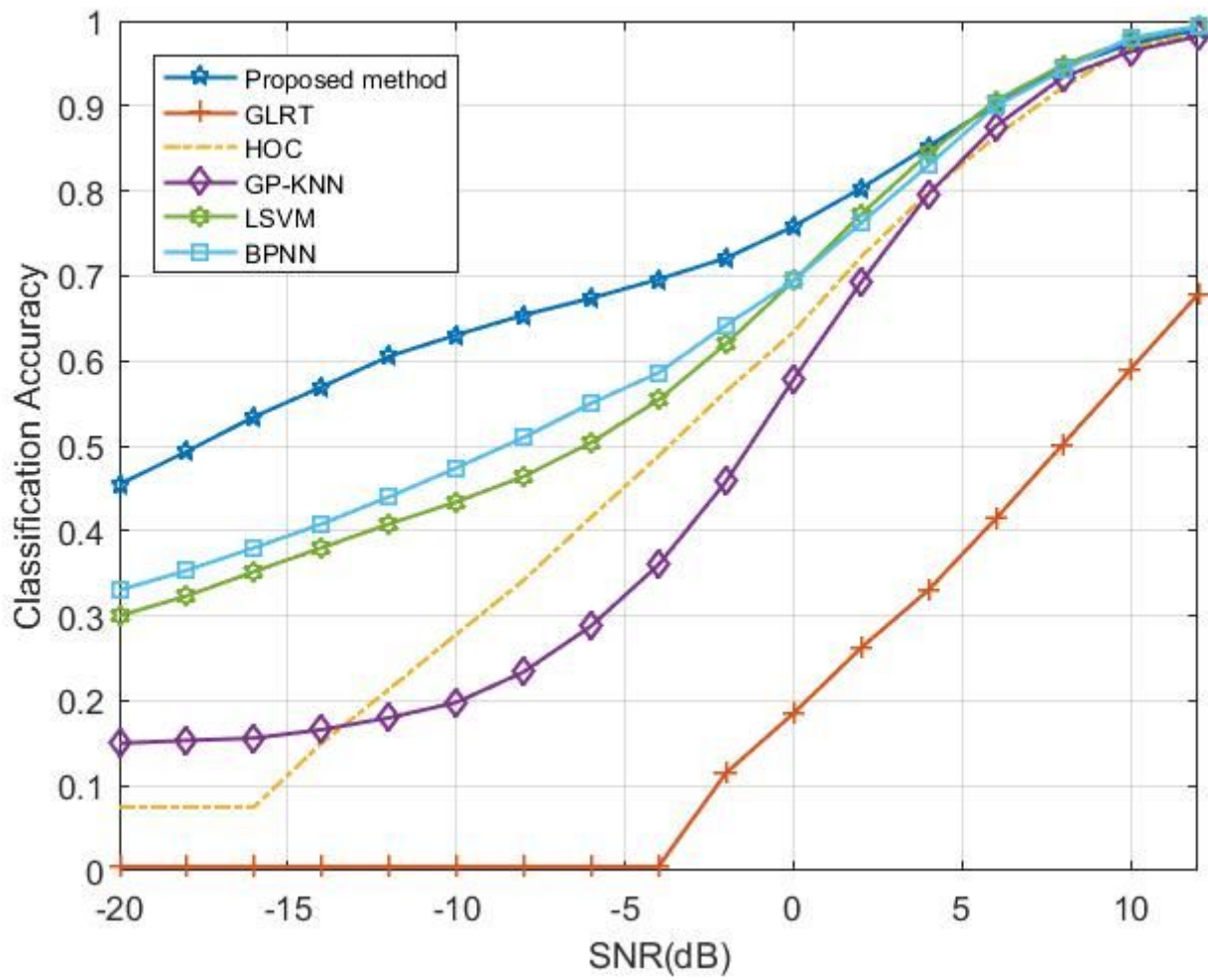


Figure 12

Confusion matrix in different SNR



**Figure 13**

Classification accuracy in different SNR



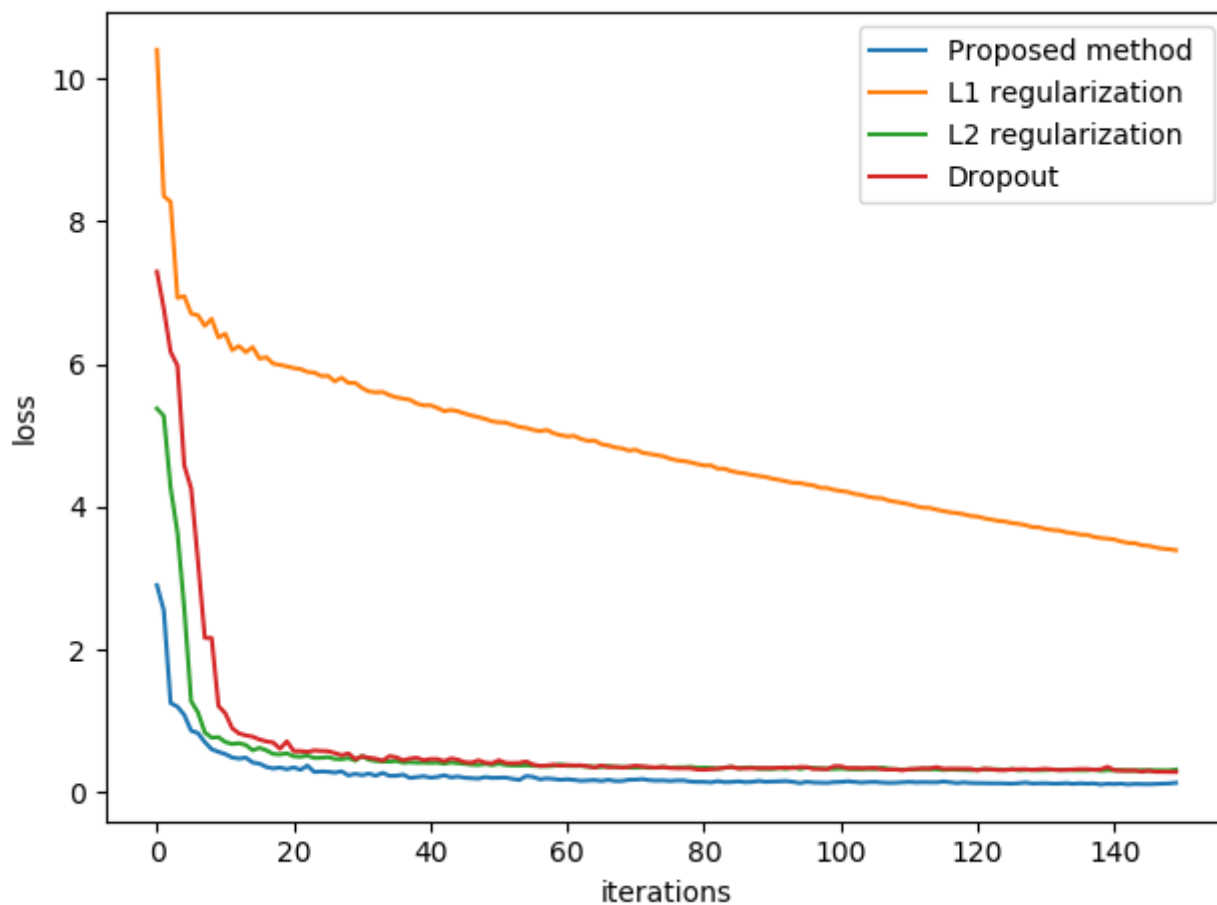


Figure 14

Loss in different regularization methods

## Supplementary Files

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- [DGFCNNAlgorithmforModulationRecognition.rar](#)