Signal Processing in Practice Assignment

Date: 26 Feb, 2024

Starter code

1. Image Classification

- Train a randomly initialized ResNet-18 model on the CIFAR-100 dataset(trainset1 and trainset2) using Cross Entropy Loss.
- Evaluate the accuracy on the CIFAR-100 test set.

2. Robustness against distribution shift

- Evaluate the accuracy of the models trained in Q1 on the additional test set given. here
- Perform the evaluation on this test set, using the model in two modes, train and eval mode.
- Vary the test batch size as 4, 8, 16, 32 and report the results in each case.

3. Self Supervised Learning

- Pretrain a ResNet-18 model for the CIFAR-100 dataset using the *trainset2* (without labels) in a self supervised manner using the SimClr objective.
 - For each batch of N images and its augmented version of N images resulting in 2N data points. Each image has one positive pair and 2(N-1) negative pairs. The loss function for a positive pair of examples is defined as

$$l(z_i, \tilde{z}_i) = \log \left(\frac{\exp(sim(z_i.\tilde{z}_i)/\tau)}{\sum_{k=1}^{N} 1_{[k\neq i]} \exp(sim(z_i.z_k)/\tau) + \sum_{k=1}^{N} 1_{[k\neq i]} \exp(sim(z_i.\tilde{z}_k)/\tau)} \right)$$
(1)

- The SimCLR loss on the batch can be obtained as

$$\mathcal{L} = \frac{1}{2N} \sum_{k=1}^{N} l(z_k, \tilde{z}_k) + l(\tilde{z}_k, z_k)$$
 (2)

- Fine tune this pretrained model using the *trainset1* using Cross Entropy loss. Then evaluate on the test set.
- Evaluate the accuracy of this finetuned model on the CIFAR-100 test set.