

Special Topics in Applications (AIL861)

Artificial Intelligence for Earth Observation

Lecture 14

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Classification: Label and Confidence

Average predicted probabilities

Label – usual $\arg \max$

Confidence – usual \max

Softmax - Overconfident

“On Calibration of Modern Neural Networks” – Modern neural networks are over-confident

- ✓ Why modern?
- ✓ Over-confident – decreased entropy. Solution – Increase the entropy.

Temperature Scaling

- ✓ Use a single scalar parameter $T > 0$ for all classes
- ✓ Divide the logit by temperature scalar before computing Softmax (**soften the Softmax**)
- ✓ $T = 1$ corresponds to the case of the actual probability
- ✓ T tends to infinity – all classes are assigned equal probability (maximum entropy)

Two Types of Ensemble

- Randomization
- Boosting

Randomization: Use Subset of Data

Why and why not?

Random Initialization

- ✓ Of neural network parameters.
- ✓ Ensemble as uniformly-weighted mixture model.

Dropout

- ✓ Different neurons dropped – different networks
- ✓ Each such network can be considered as a Monte Carlo sample from the space of all available models

Dropout

- ✓ Simply apply dropout at test time.
- ✓ Instead of one prediction, we get many, one for each model.
- ✓ Score can be averaged or distribution can be computed.