

Goal: A brief overview unsupervised learning and multi-layer perceptrons (MLPs).

MLP: Perceptron, weights, non-linear activation function, feed-forward topology.

Let X be the stimuli space and Y be the (discrete) set of class labels.

Supervised Learning Problem: To classify¹ stimuli based on example stimulus-class pairs.

- **Input:** *labeled training examples* $\{(x_1, y_1), \dots, (x_n, y_n)\}$ drawn from $P(x, y)$, and unlabeled stimuli $\{x_{n+1}, \dots\}$ to be classified.
- **Output:** Best-guesses for class labels $\{y_{n+1}, \dots\}$, or more generally estimates of the probabilities $P(y|x_{n+1})$, etc.
- **Evaluation:** Mean-square error of predicted to actual class labels, or expected perplexity.
- **Example:** A child learning sees images x_i and is told by their parent the name y_i of that type of object.
- **Implementation:** An MLP with any number of layers, x presented to first layer, weights trained via back-propagation of error between output layer and y .

Unsupervised Learning Problem: To learn class structure from stimuli.

- **Input:** *unlabeled examples* $\{x_1, \dots, x_n\}$ drawn from marginal $P(x)$.
- **Output:** Inferred class structure Y and or more estimates of the probabilities $P(y|x_i)$.
- **Evaluation:** Mutual information between learned class structure and actual structure.
- **Example:** A feral child sees images x_i but has no parent to tell them the names of things.
- **Implementation:** An MLP with each layer trained to satisfy suitable intrinsic statistical criteria (such as fidelity and sparsity). Methods include sparse autoencoders, restricted Boltzmann machines, and perhaps a multi-neuron version of Chklovskii's rule.

Semisupervised Learning Problem: To classify stimuli given many unlabeled examples and limited labeled examples.

- **Input:** That of both supervised and unsupervised cases.
- **Output:** Same as supervised case.
- **Evaluation:** Same as supervised case.
- **Example:** A child who sees many images only some of which are named for them.
- **Implementation:** The MLP of unsupervised case plus a final supervised stage.

¹This discussion is in terms of classification, but the concepts can be easily extended to regression, reinforcement learning, and other frameworks.