COMP90051 Statistical Machine Learning

Workshop Week 6

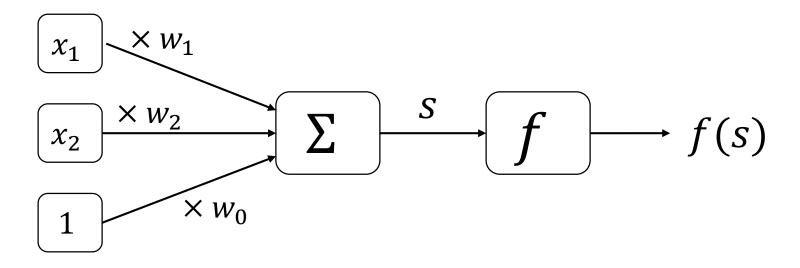
Xudong Han

https://github.com/HanXudong/COMP90051_Workshops

Your tutor

- Xudong Han
- xudong.han@unimelb.edu.au
- Slides https://github.com/HanXudong/COMP90051_Workshops

Review of the perceptron



•
$$f(s) = \begin{cases} 1 & \text{if } s \ge 0, \\ -1 & \text{otherwise} \end{cases}$$

Perceptron training algorithm

```
Perceptron(\mathbf{w}_0)
        \mathbf{w}_1 \leftarrow \mathbf{w}_0 \qquad \triangleright \text{typically } \mathbf{w}_0 = \mathbf{0}
         for t \leftarrow 1 to T do
    3
                      Receive(\mathbf{x}_t)
                      \widehat{y}_t \leftarrow \operatorname{sgn}(\mathbf{w}_t \cdot \mathbf{x}_t)
    5
                     Receive(y_t)
                     if (\widehat{y}_t \neq y_t) then
    6
                                 \mathbf{w}_{t+1} \leftarrow \mathbf{w}_t + y_t \mathbf{x}_t \quad \triangleright \text{ more generally } \eta y_t \mathbf{x}_t, \eta > 0.
    8
                      else \mathbf{w}_{t+1} \leftarrow \mathbf{w}_t
    9
           return \mathbf{w}_{T+1}
```

Pytorch

 Pytorch is an open-source Python library designed for fast matrix computations on CPU/GPU. This includes both standard linear algebra and deep learning-specific operations. It is based on the neural network backend of the Torch library. A central feature of Pytorch is its use of Automatic on-the-fly differentiation (Autograd) to compute derivatives of (almost) all computations involving tensors, so we can make use of gradientbased updates to optimize some objective function. In this workshop we will introduce some fundamental operations in Pytorch and reimplement the Perceptron and logistic regression classifiers in Pytorch.

Computational Model

TensorFlow: Static Graphs
 Nodes represent operations (e.g. Matrix multiplication).

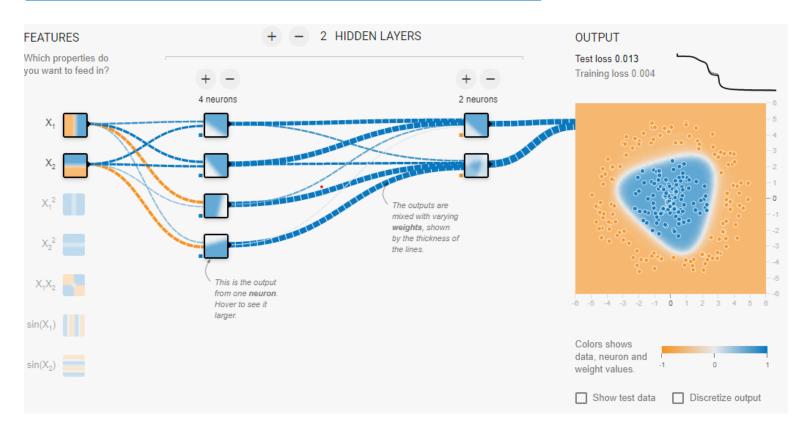
 Edges represent tensors and flow between nodes.

• User defines computational graph beforehand, to be executed at later stage.

Scalar	Vector	Matrix	Tensor
0	1	2	3+

Computational Model

https://playground.tensorflow.org



Computational Model

- Pytorch: Dynamic
 Necessary computation graph metadata is
 generated automatically each time an operation is
 executed.
- Multiple advantages:
- Allows different computational architecture for each training example/batch - more flexible algorithms, especially for dynamically sized data.
- II. Control flow (if, while) can be implemented in host language.

Basic Operations

The basic API is extremely similar to NumPy

• Try!

 https://pytorch.org/docs/stable/torch.html#mathoperations

AUTOGRAD MECHANICS

https://pytorch.org/docs/stable/notes/autograd.ht
 ml

```
>>> x = torch.randn(5, 5)  # requires_grad=False by default
>>> y = torch.randn(5, 5)  # requires_grad=False by default
>>> z = torch.randn((5, 5), requires_grad=True)
>>> a = x + y
>>> a.requires_grad
False
>>> b = a + z
>>> b.requires_grad
True
```