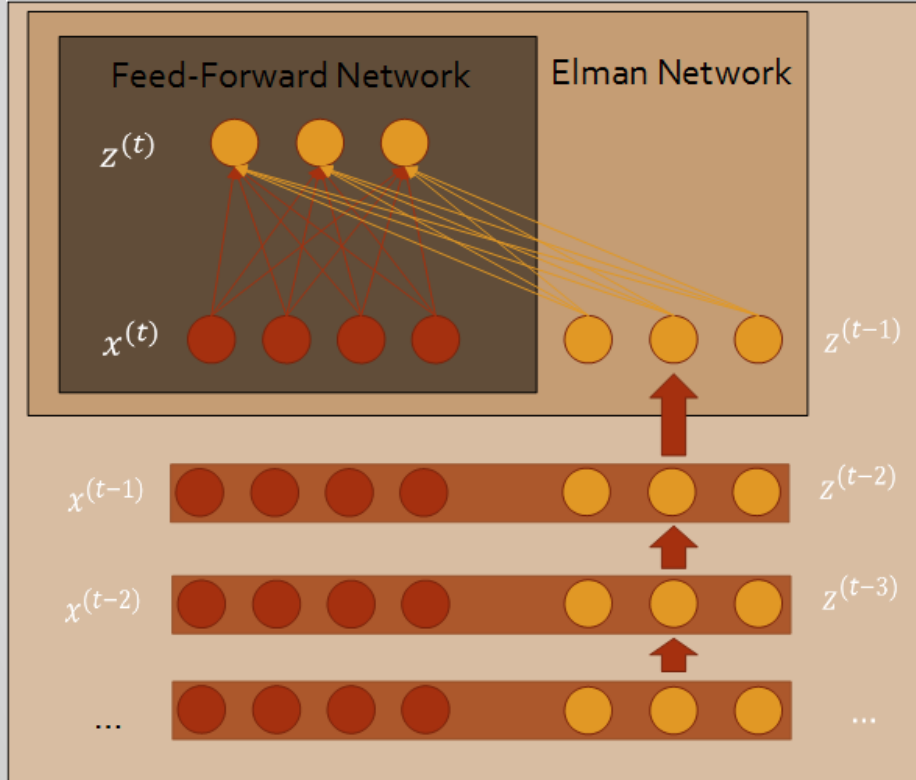


# Deep Learning with Theano

Presented by Chuong Ngo

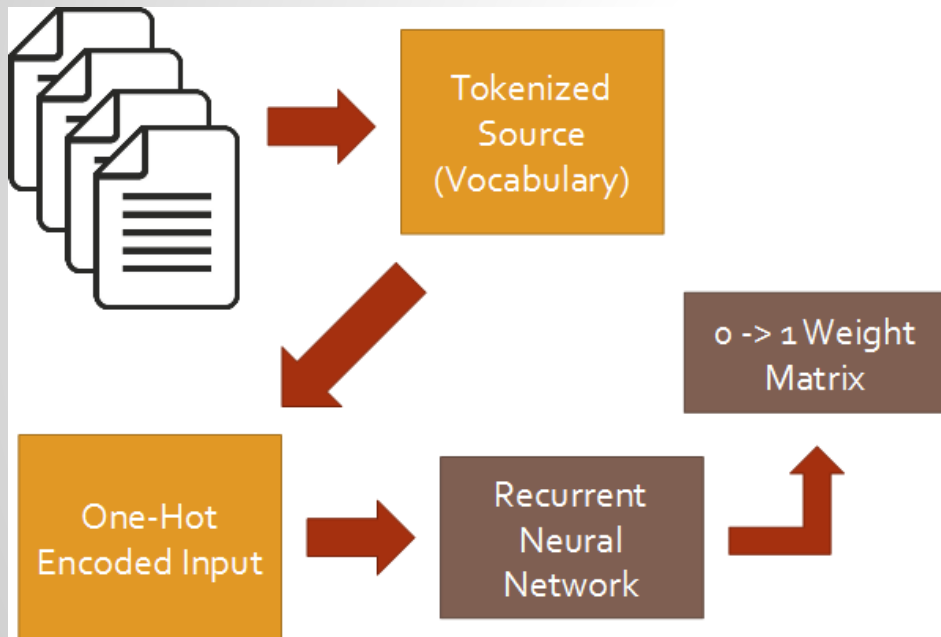
Some slides and/or images provided by Kyle Wallace  
Based on the work by White et. al

# Recurrent Neural Networks (RNN)



- Augmented with *Elman Networks*
  - Short-term memory
- Deep Learning Structure
  - Greater previous context
- Trained with *backpropagation through time*

# RNN and Software Engineering



- Vocabulary set from tokenized source
  - One-hot encoding
- Stochastic gradient descent
- Softmax over classes and output
  - Decreases runtime.
- Sigmoid activation

# Theano Overview

- Python library and optimizing compiler for ML
  - By University of Montreal
- Package of various technologies
- Compiled and function optimizations
- Runs on CPU/GPU



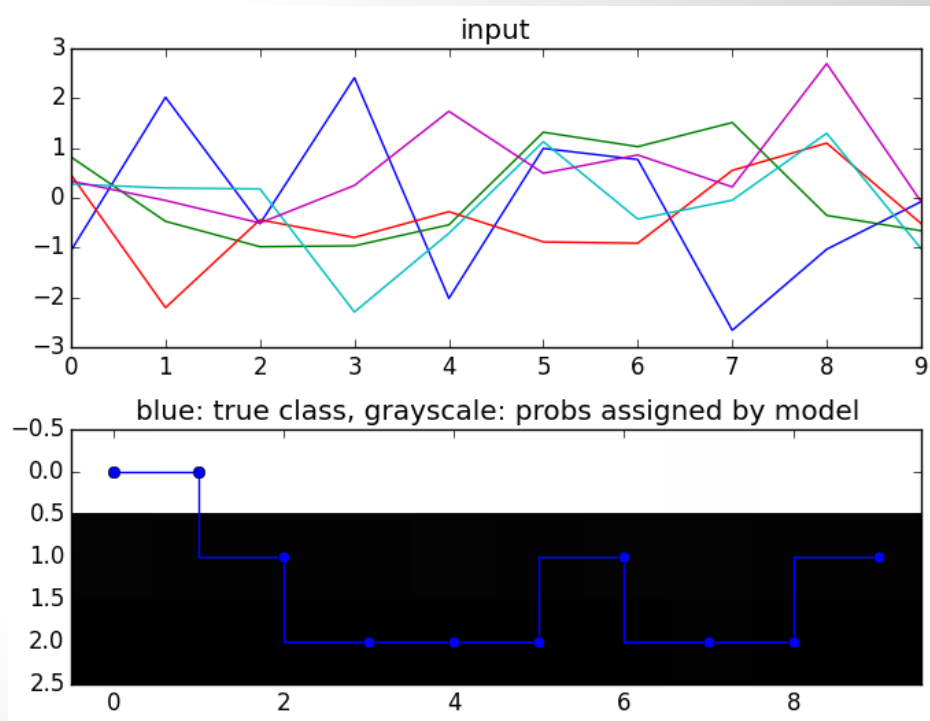
# RNNs and Theano

```
55 # the hidden state `h` for the entire sequence, and the output for the
56 # entire sequence `y` (first dimension is always time)
57 [self.h, self.y_pred, self.cl_pred], _ = theano.scan(self.step,
58               sequences=self.input,
59               outputs_info=[self.h0, None, None])
60
61 # push through softmax, computing vector of class-membership
62 # probabilities in symbolic form
63 self.y_prob = T.nnet.softmax(self.y_pred)
64 self.cl_prob = T.nnet.softmax(self.cl_pred)
65
66 # compute prediction as class whose probability is maximal
67 self.y_out = T.argmax(self.y_prob, axis=-1)
68 self.cl_prob = T.argmax(self.cl_prob, axis = -1)
69 self.loss = lambda y: self.nll_multiclass(y)
70
71 def step(self, x_t, h_tm1):
72     h_t = self.activation(T.dot(x_t, self.W_in) + T.dot(h_tm1, self.W))
73     y_t = T.dot(h_t, self.W_out)
74     cl_t = theano.dot(h_t, self.W_cl)
75
76     return h_t, y_t, cl_t
77
```

- Shared variables
  - Lower memory footprint
- Scan
  - Less memory used
  - Slightly faster
  - Can see previous  $n$  time steps
- Taps - allows for multiple inputs

# Way Ahead

- Run one-hot encodes through RNN
  - Type errors
- Compare performance (time)
  - Is Theano faster?
- CPU vs GPU
  - Is the GPU worth it?



# Deep Learning Structures & Software Engineering Tasks

- Where else can Deep Learning be used?
- Deep Autoencoders
  - Compressed representation of data
  - Clone detection?
  - Error prediction?
- Deep Belief Networks
  - Error prediction?
  - API preconditions?

**Questions?**