# Deep Learning for Sequences

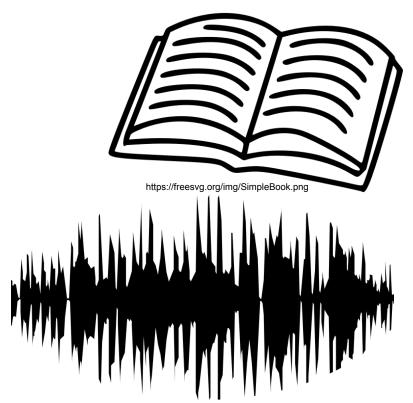
UTMIST Study Group - Module 5

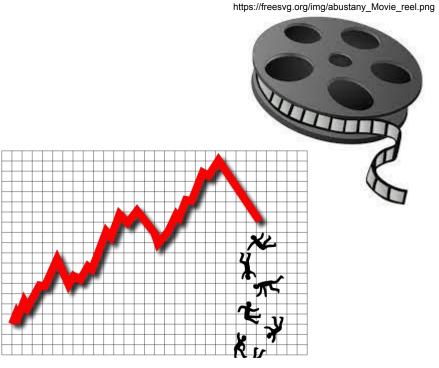
## Agenda

#### **Recurrent Neural Networks**

- Motivation
- Architecture
- Training
- LSTM
- GRU
- Applications

# Sequences are Everywhere





https://freesvg.org/img/1449602440.png

https://www.maxpixel.net/static/photo/1x/Sfa-Jazz-Music-Wave-Sound-Audio-1293262.png

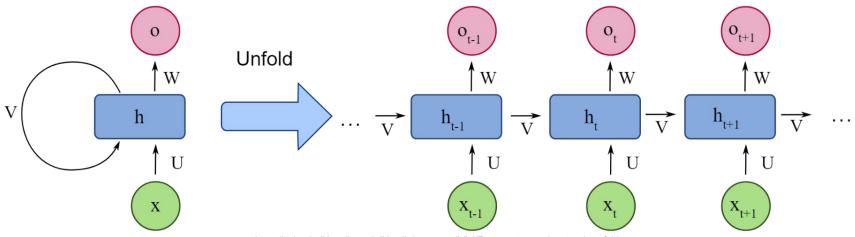
# Sequential Memory

- Try saying the alphabet in forwards or backwards order. Which one is easier?
- Start saying the alphabet at G. Did you struggle with the first few letters but got easier afterwards?

#### A B C D E F G H I J K L M N O P Q R S T U V W X Y Z

### RNN Architecture

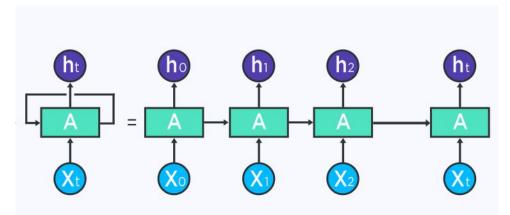
- Previous output used as input
- Process input of arbitrary length
- Weight shared across time
- <u>Illustrated example</u>



https://upload.wikimedia.org/wikipedia/commons/b/b5/Recurrent\_neural\_network\_unfold.svg

## Backpropagation Through Time

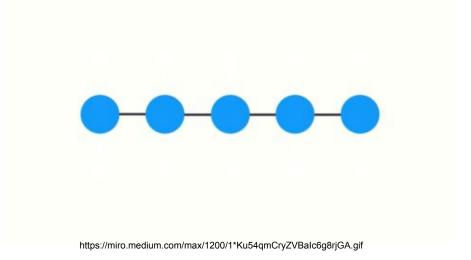
- 1. Unroll RNN through time
- 2. Back propagate error from last to first time step
- 3. Calculate error at each time step
- 4. Update weight at each time step



https://cdn.builtin.com/sites/www.builtin.com/files/styles/ckeditor\_optimize/public/inline-images/national/unrolled-rnn\_0.png

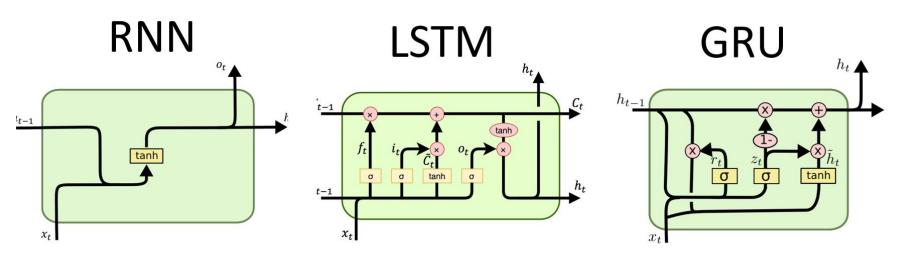
## Vanishing Gradient Problem

- Short-term memory
- In back-propagation, gradient calculation is dependent on previous layer
- This causes gradient and weight adjustment to shrink



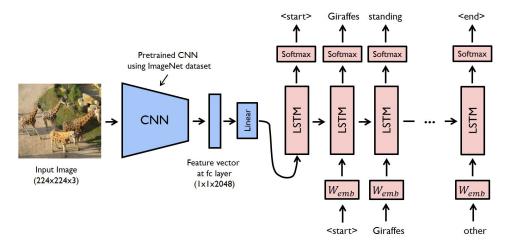
## Solution: LSTM & GRU

- Long Short Term Memory (LSTM) & Gated Recurrent Unit (GRU)
- Gates that selectively update long-term memory
- Illustrated example



## Applications

- Sequence generation: music generation, image captioning
- Sequence classification: sentiment analysis
- Sequence translation: machine translation, speech to text
- Check our study group's GitHub page for useful links



Thank You!:)