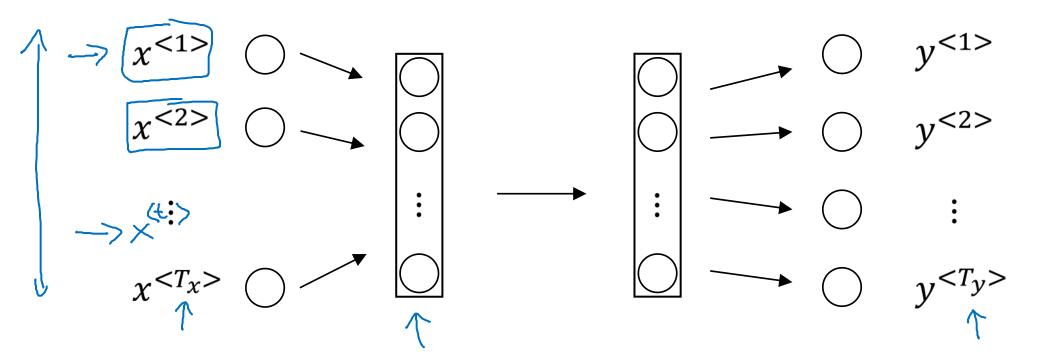


Recurrent Neural Networks

Recurrent Neural Network Model

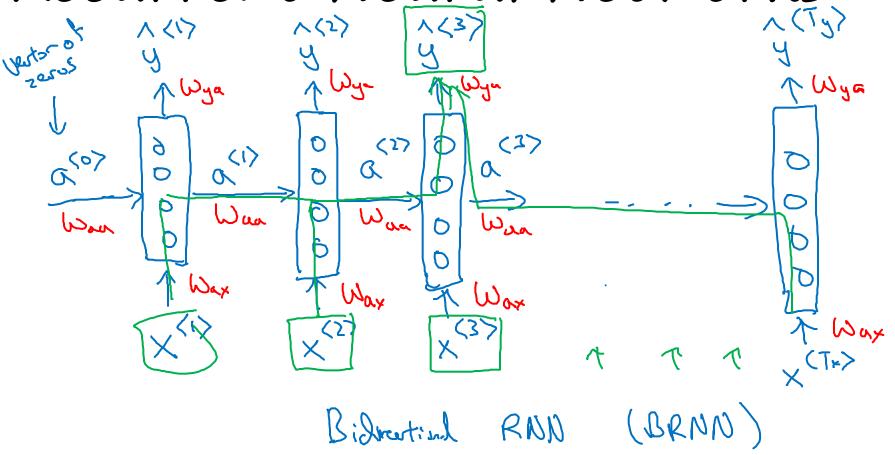
Why not a standard network?

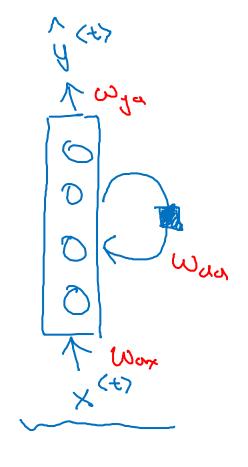


Problems:

- Inputs, outputs can be different lengths in different examples
- > Doesn't share features learned across different positions of te

Recurrent Neural Networks





He said, "Teddy Roosevelt was a great President."

He said, "Teddy bears are on sale!"

Forward Propagation Wax X Propagation of State of the Sta $(a^{<1})$ $a^{< T_{\chi}-1>}$ a(1) = g(Waa a(0) + Wax x(1) + ba) < tonh | Rely g(1) = g(Waa a(1) + by) < signoid $O_{\langle a \rangle} = \frac{1}{2}$ act = g(Waa act-1) + Wax x + ba)

g(t) = g(Wya act) + by)

Andrew Ng

Simplified RNN notation

$$a^{< t>} = g(W_{aa}a^{< t-1>} + W_{ax}x^{< t>} + b_a)$$

$$\hat{y}^{< t>} = g(W_{ya}a^{< t>} + b_y)$$

$$\begin{cases} \hat{y}^{< t>} = g(W_{ya}a^{< t>} + b_y) \end{cases}$$

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