

Neural Networks: II. Recurrent NN (Part 8)

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- Before: "simple" Input \rightarrow "simple" Output
- Now:
 - Stock Market Analysis (Time Series)
 - Google Translate
 - describing a photo with words

S&P 500

$$h_t = f(h_{t-1}, x_t; W), \quad t = 1, \dots, T$$

- h_t : New hidden state
- f : Activation function (same for all t)
- h_{t-1} : Old hidden state
- x_t : Input at some time t
- W : Weights (same for all t)

\rightsquigarrow Output: $y_t = y_t(h_{t_y})$

"many to one"

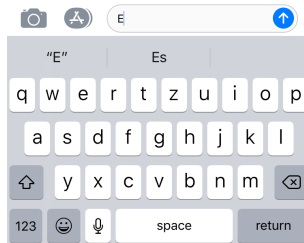
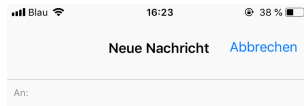
$x_1, \dots, x_T \rightarrow y_T$ (e.g. Stock Market Analysis)

"many to many"

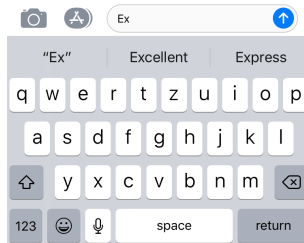
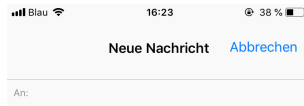
$x_1, \dots, x_T \rightarrow y_1, \dots, y_T$ (e.g. Google Translate, texting a SMS)

"Gestern habe ich mit meinem Nachbarn im Garten Fußball
gespielt geschaut"

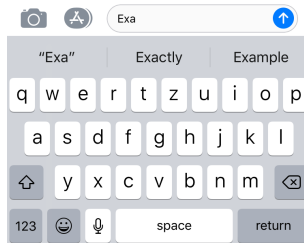
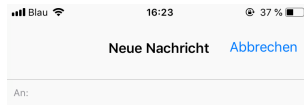
Example: Texting "Example"



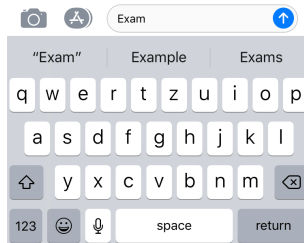
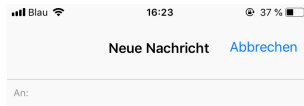
Example: Texting "Example"



Example: Texting "Example"



Example: Texting "Example"



"one to many"

$x_1 \rightarrow y_1, \dots, y_T$ (e.g. Describing a photo)

Example: Describing a photo



What about Backpropagation? \rightsquigarrow truncated Backpropagation in time

- feed forward in time "forever"
- backprop for only some small step t_p
- t_p is a hyperparameter chosen to be computational efficient

- Neural Joke Generation (He Ren, Quan Yang)
- Generating Sequences With Recurrent Neural Networks (Graves)
- "Sunspring" film