



#### Working with sequences

Recurrent Neural Networks (RNNs)

Dealing with longer sequences (LSTMs)

Reusable embeddings



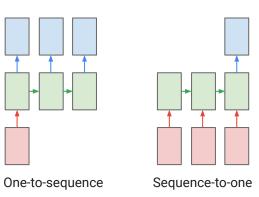
# Sequences are another common and important domain

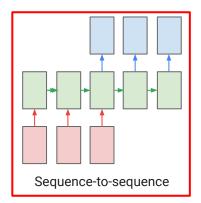




## What sort of problem is translation?

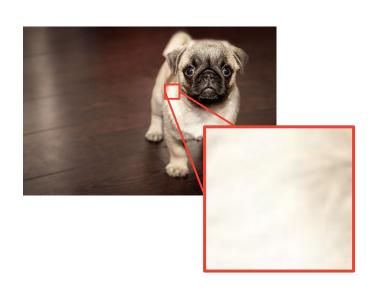


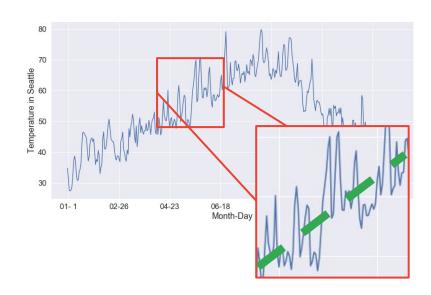






## Locality is important for images and sequences







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### Two key ideas for RNNs

RNNs learn a compact hidden state that represents the past.

The input to an RNN is a concatenation of the original, stateless input and the hidden state.



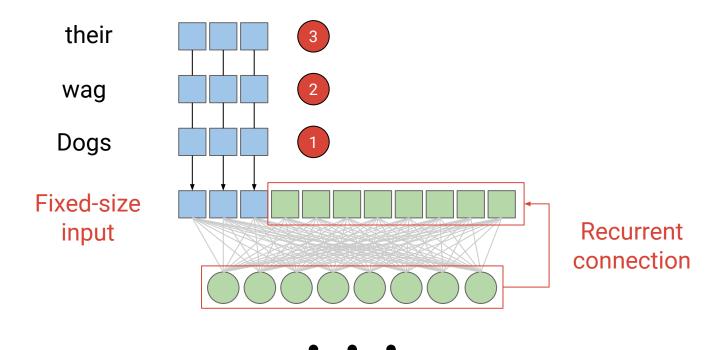
### How RNNs remember the past

Recurrent connection

2 Clever optimization



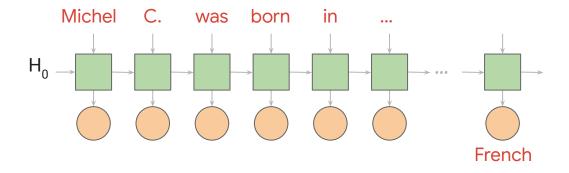
#### The recurrent connection





## Problem with RNNs: Long term dependencies

"Michel C. was born in Paris, France. His mother tongue is ????"



T = max sequence length



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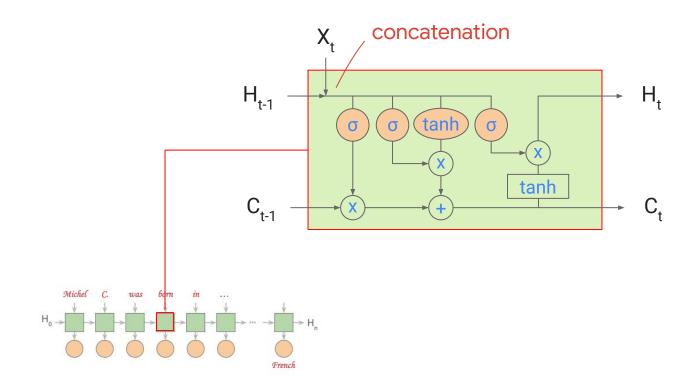
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#### LSTM cell





#### Gated Recurrent Unit (GRU)

$$X = X_{t} \mid H_{t-1}$$

$$2 \text{ gates instead of 3}$$

$$=> \text{ cheaper}$$

$$X' = X_{t} \mid r * H_{t-1}$$

$$X'' = \text{ tanh}(X' \cdot \text{Wc} + \text{bc})$$



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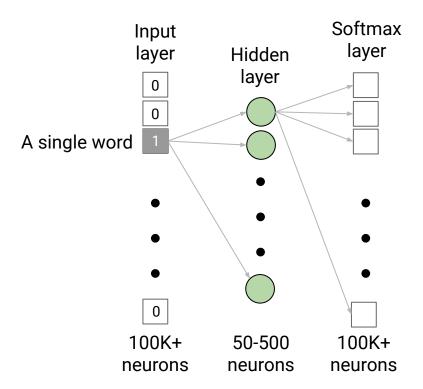
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#### Reusable embeddings

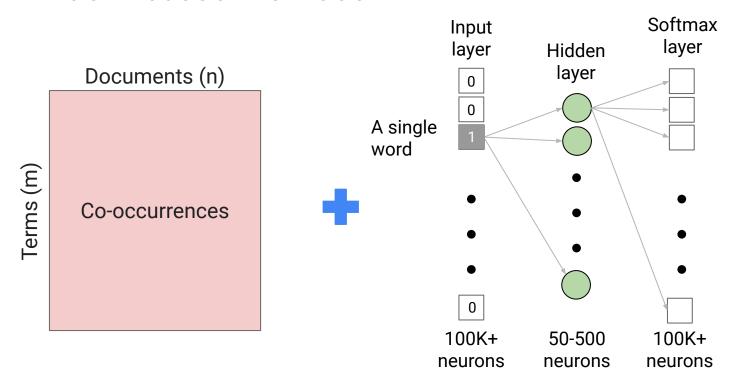


#### Word2Vec's network architecture



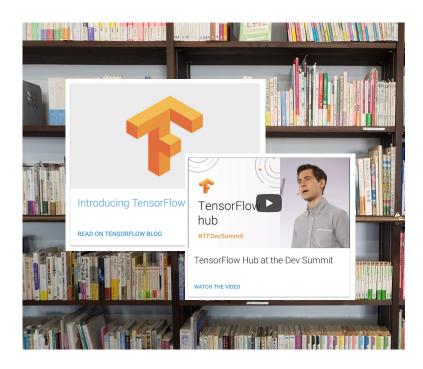


# GloVe is a hybrid between matrix factorization and window-based methods





# TensorFlow Hub makes using pre-trained embeddings easy



Simply pull from a library of pre-trained embeddings.



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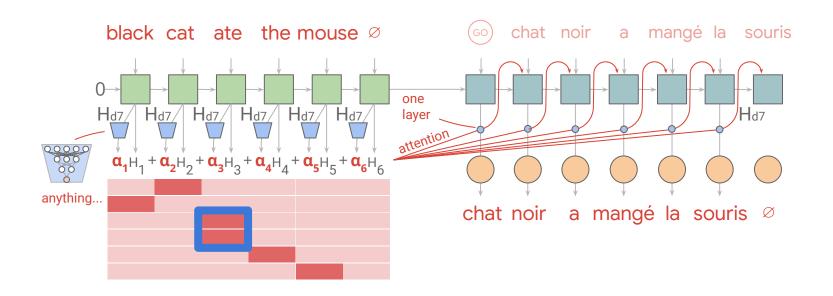
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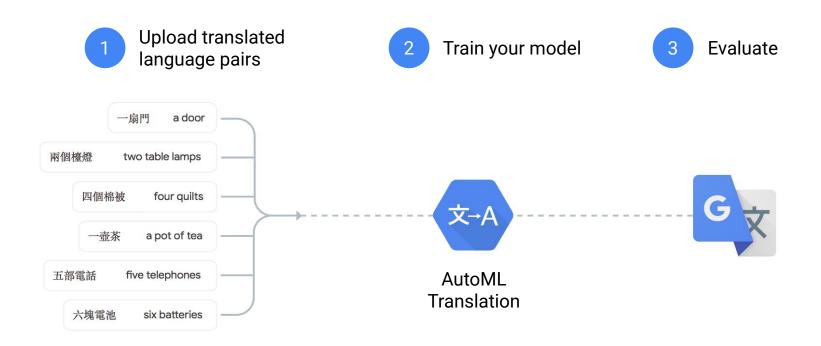


#### Improve the translation with attention network





#### How AutoML Translation<sup>BETA</sup> works?





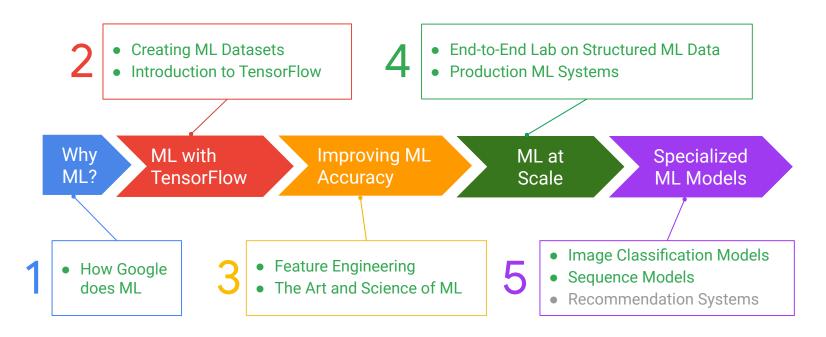
### Natural language conversations



An end-to-end developer platform for building natural and rich conversational experiences.



#### Machine learning on Google Cloud Platform





cloud.google.com

