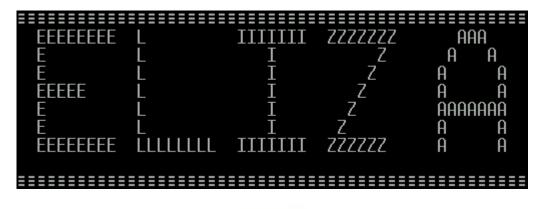
## A Neural Conversation Model

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#### Problem Statement

· To create a chatter bot capable to chat in natural language as humans do.







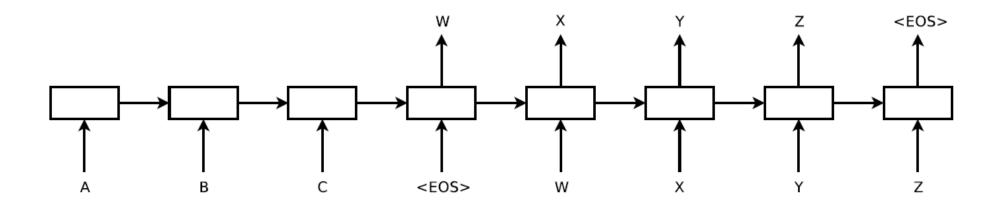


#### **DNNs** in Conversations

- · The inputs and targets are required to be of fixed dimensionality
- Many problems that deal with sequence of inputs or targets where the dimensionality can not be predicted a-priori
- · Eg. Speech Recognition, Machine Translation and Question-Answering

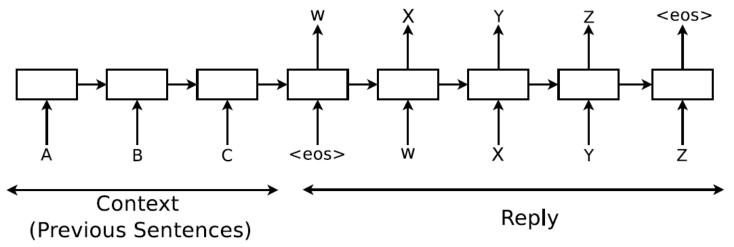
# Seq2Seq

- One LSTM reads a whole Sequence at a time to generate a single vector with a large dimensionality.
- The Second LSTM is a RNN which is conditioned on the input sequence.



## A Conversational Model

- A Translation Model using Seq2Seq will be easier than a conversational model due to no context required.
- Input sequence is the concatenation of what has been conversed so far.
- Lack of general world knowledge is another limitation of the purely unsupervised model.



# IT Helpdesk Troubleshooting

#### **VPN** Issue

Machine: hi
Human: hello

**Machine:** *could you please let me know what are* 

the operating systems you are using?

**Human:** *i am using linux* 

**Machine:** ok it was in the ssl vpn on which you

stated it was broken

Machine: please check if you are logged in to

corp network

Machine: what is the error that you are running

please

**Human:** i am seeing an error related to vpn

Machine: what is the error message that you are getting when connecting to vpn using network

connect?

Human: connection refused or something like

that

**Machine:** may i know the version of network

connect you connect?

**Human:** i am not sure i know that

**Machine:** is the network connect prompting for

any user certificate

Machine: ? Human: yes

**Machine:** are you at home or at work at the mo-

ment?

**Machine:** office?

**Human:** *i am at home* 

Machine: try this

**Machine:** goto <URL> page and enter your

name and password

Human: done

**Machine:** try logging in with <NAME> and

check if its working fine now **Human:** yes, now it works!

Machine: great

Machine: anything else that i can help

**Human:** no, that was very useful

**Machine:** you are other than  $\langle NAME \rangle$ :)

Machine: have a nice night

## The Dataset

- · OpenSubtitles dataset Tiedemann 2009.
- Movie conversations in XML format.
- Training Dataset: 62M sentences (923M tokens)
- Validation Dataset : 26M sentences (395 tokens)
- Quite large but noisy
- This is an open-domain conversation dataset so expected results are quite fascinating.

## Cleverbot vs NCM

#### **Cleverbot**

**Human:** What do you think about tesla?

CleverBot: I am tesla.

**Human:** What do you think about cleopatra?

**CleverBot:** Cool is cool.

Human: What do you think about england dur-

ing the reign of elizabeth?

**CleverBot:** *I like him. Do you?* 

**Human:** What do you think about bill gates?

CleverBot: Lets talk about Link.

#### **Neural Conversational Model**

**Human:** what do you think about tesla?

**Machine:** he 's a good conductor.

**Human:** what do you think about bill gates?

Machine: he 's a good man.

**Human:** What do you think about messi?

**Machine:** he 's a great player.

**Human:** what do you think about cleopatra?

**Machine:** oh, she 's very regal.

Human: what do you think about england dur-

ing the reign of elizabeth?

Machine: it was a great place.

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# Questions?