

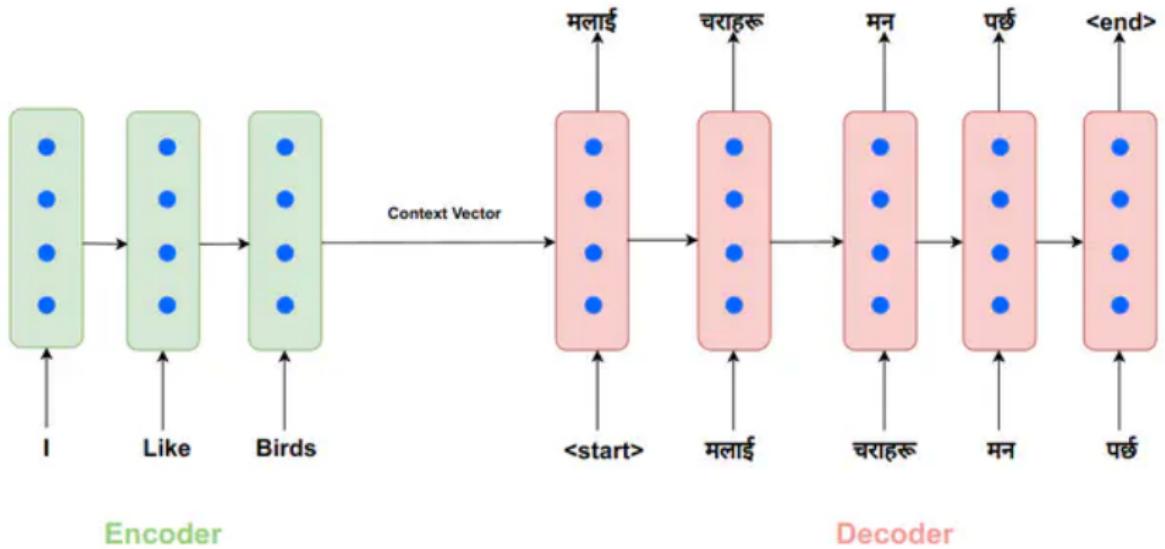
Machine Translation

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Neural Models

Adapted from material by Philipp Koehn, Mohit Iyyer, Luke Zettlemoyer, Kalpesh Krishna, Karthik Narasimhan, Greg Durrett, Chris Manning, Dan Jurafsky



From Aayush Neupane

Neural MT for the Win

- Fringe in 2014: First seq2seq paper published
- 2016: Google Translate switches from SMT to NMT

Neural MT for the Win

- Fringe in 2014: First seq2seq paper published
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- Why?
 - ▶ Representations allow generalization
 - ▶ Not tied to “words”
 - ▶ Attention allows long-range generalization

Distributed Representations

Distributed Representations



Distributed Representations



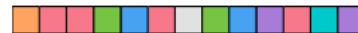
Distributed Representations



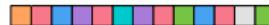
Distributed Representations



Distributed Representations



Weasel Trainer



Weasel Trainer



BIRDS AREN'T REAL

ENRON "BIRDS ARE
A GOVERNMENT
SURVEILLANCE DEVICE"

WAKE
UP



BIRDS
AREN'T
REAL

LIES

birds charge on power lines

RESEARCH

THE
NEWS WITH
SHEPARD
SMITH

"BIRDS AREN'T REAL" IS A PARODY
CONSPIRACY THEORY "WITH A PURPOSE"

CNBC

Birds Aren't Real

LAMAR

054830

Words Aren't Real

LAMAR

054830

Word / Phrase Translation in Close Languages

Language	Sentence
English	How much does the weasel trainer charge?
Portuguese	Quanto cobra o treinador de doninhas?
Spanish	¿Cuánto cobra un entrenador de comadrejas?

What finer-grained outputs makes possible

- Capturing agreement markers (case, gender, number)
- Honorific / tense particles
- Topic markers
- Otherwise needs to be memorized (limits generalization)

Ist dir kalt?

Are you cold?

Ist dir kalt?

Are you cold?

Ist dir kalt?

Are you cold?

Ist dir ohne deine blaue Jacke kalt?

Are you cold without your blue jacket?

Ist dir kalt?

Are you cold?

Ist dir ohne deine blaue Jacke kalt?

Are you cold without your blue jacket?

Ist dir kalt?

Are you cold?

Ist dir ohne dei
ke kalt?

Are you cold with
the jacket?



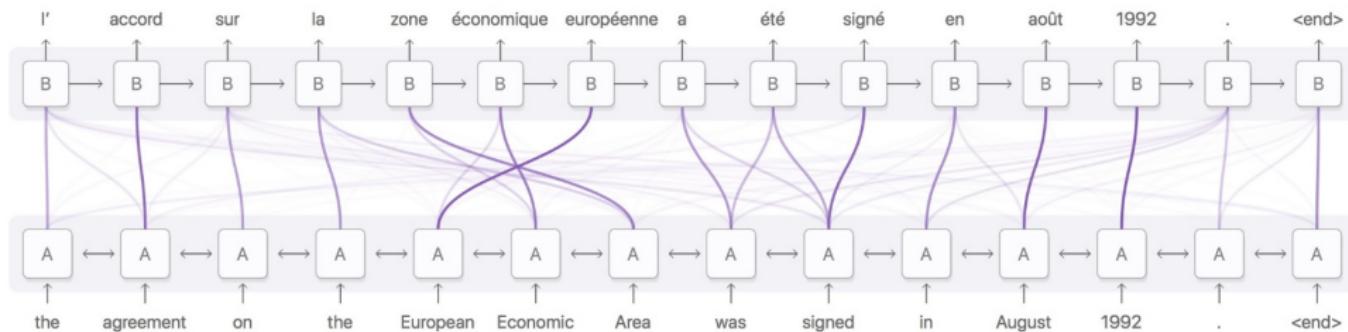
Ist dir ohne deine neue Kettensäge und Hockeymaske kalt?

Are you cold without your new chainsaw and hockey mask?

Ist dir ohne deine neue Kettensäge und Hockeymaske kalt?



Are you cold without your new chainsaw and hockey mask?



From Chris Olah <https://distill.pub/2016/augmented-rnns/>

