

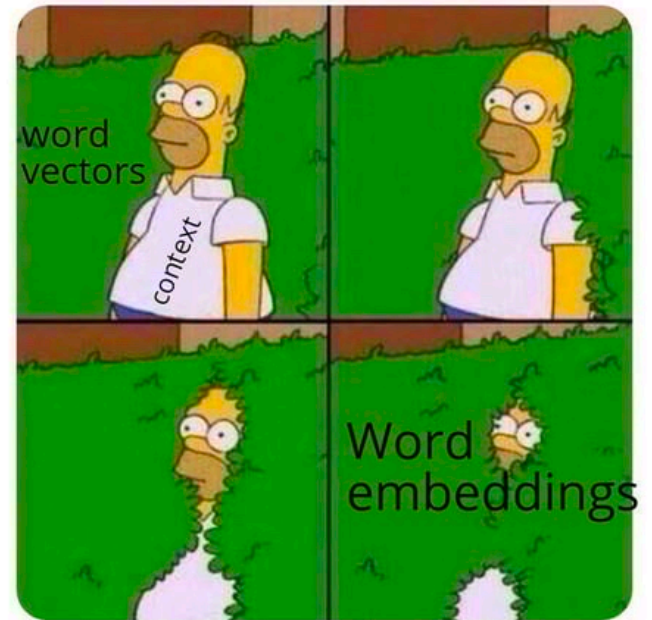
May 12, 2023.

DSML: NLP module.

Word embeddings
in a nutshell

Attention → Transformers

Class starts
@ 9:05



When you penalize your Natural Language Generation model for large sentence lengths



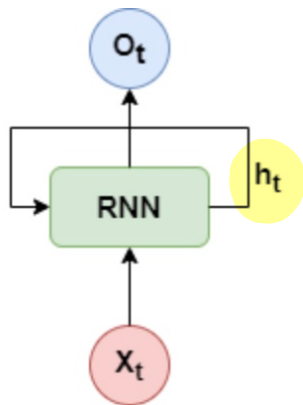
Recap:

- * The problem: capture correct contextual information from a previously seen text, and apply it correctly when needed.

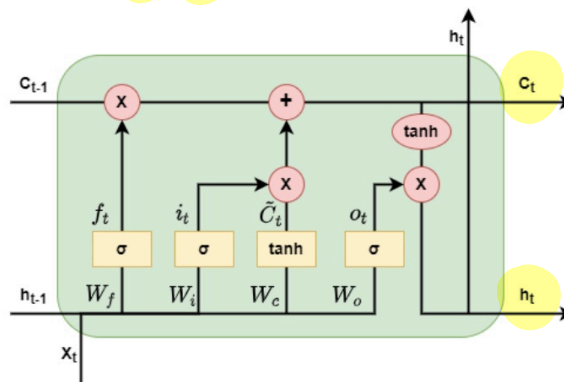
weakness of

- * Approaches we have seen so far:

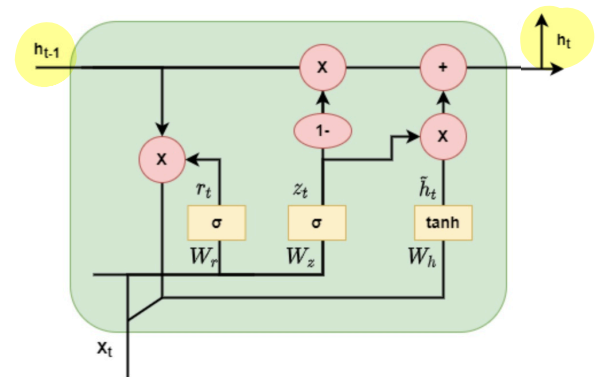
(a) RNNs



(b) LSTMs



(c) GRUs



Recap: Attention Mechanism.

Key/Value: "Food₀ is₁ good₂, but₃ price₄ is₅ high₆." → vectors.
 $d = 5$

Query: "Cost"₀ → $d = 5$

Attention Mechanisms Computation Flow

Calculate similarity between text seen before & Query.

Inner product.

the text using which o/p should be generated.

Step 1 Get Key Vectors

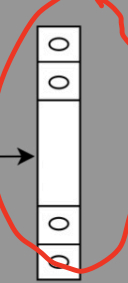
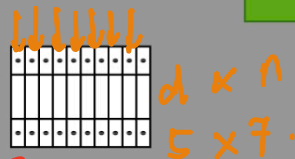
Step 2 Get Query Vectors

Step 3 Compute Energy Score

Step 4 Compute Attention weight

Step 5 Get Value Vectors

Step 6 Compute Context Vectors



Recap: Deep Dive into LSTM Results:

①

Review: facebook has suspended canadian firm claiming it may be affiliated with cambridge analytica and improperly received its users data in response to facebook's action said that it has never been and is not a part of cambridge analytica earlier it was revealed that cambridge analytica exploited the data of facebook users to meddle in the us elections

Original summary: start (facebook suspends) (canadian firm) amid (data scandal probe) end
Predicted summary: start (facebook suspends) (facebook) over (fake news data scandal) end

①

②

Review: siddaramaiah on thursday accepted a nine member committee's design for the proposed official state flag the committee was set up last year to examine the legal feasibility of an official state flag after demands by pro kannada activists if the centre approves the proposal karnataka will be the second state to have a separate flag after jammu and kashmir

Original summary: start (karnataka government) (unveils) (official state flag) end
Predicted summary: start (karnataka govt) (to launch) (new political entity) end

②

Problems:

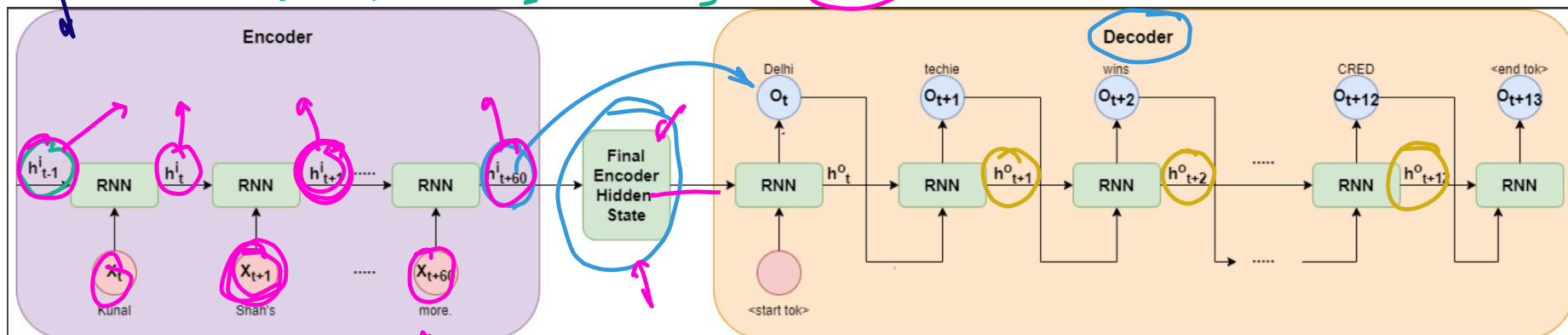
- 1] Forgetting necessary information.
- 2] Focuses on the wrong parts of the text while generating summary.

Agenda:

- * How to use attention to fix problems with RNN/LSTM/GRUs?
- * Different types of attention mechanisms.
- * Code: Using attention for Aspect based sentiment analysis.
- * Transformers: Do we even need an RNN?

LSTM Encoder Decoder Architecture.

→ food is good but price is high.



Attention:

- ① Maybe try passing all hidden states forward.
- ② Maybe also try passing info of the input word.

✓ Key Vectors.

↑
hidden states from encoder.

✓ Query Vectors.

↑
hidden states from decoder.

Energy Score → $\langle \cdot \rangle \rightarrow$ inner product.

✓ Value Vectors

↑
hidden states from encoder.

Attention weights (softmax)

↓
⊗

Context Vector C_t

Before Attention (RNN math)

$$\underline{O_t} = f\left(\overset{\text{dec}}{h_{t-1}}, O_{t-1}\right)$$

↑ ↑

After attention.

$$O_t = f\left(\overset{\text{dec}}{h_{t-1}}, O_{t-1}, c_t\right)$$

context vector
from attention
block.

Designing attention mechanisms:

Q1] How to set Key, Query, Value?

Ans. Highly dependent on use case / task that we are performing.

Q2] How to generate energy score & Attention weights?

Ans. Choose one of many options.

Q3] How to use content vector?

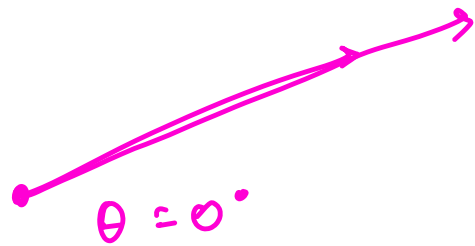
Ans. Highly dependent on use case / task that we are performing.

Key \rightarrow $(n \times 1)$ Query is $(k \times 1)$
where $k \neq n$

$$\underbrace{Q_{1 \times k}^T \quad W_{k \times n} \quad K_{n \times 1}}$$

$$\text{cosine similarity} = \underbrace{1 - \text{cosine_distance}}.$$

$$\checkmark \underline{\text{cosine distance}} = \underline{1 - \text{cosine similarity}}.$$



$$\cos(\theta) = 1$$

$$-1 \quad 1$$

$$\text{distance} \rightarrow 0 \text{ --- } \infty.$$

0 - 2.

Which of the following statements is/are True:

- A. Magnitude of vector affects Cosine similarity. **F**
- B. Range of Cosine Similarity is from $[-1, 1]$ and that of Cosine Distance is $[0, \infty)$ **F**
- T** C. Cosine Similarity is used to capture the relationship of the words within a corpus, with other words.
- D. Cosine Similarity = $1 - \text{Cosine Distance}$ **T**

will get this fixed.