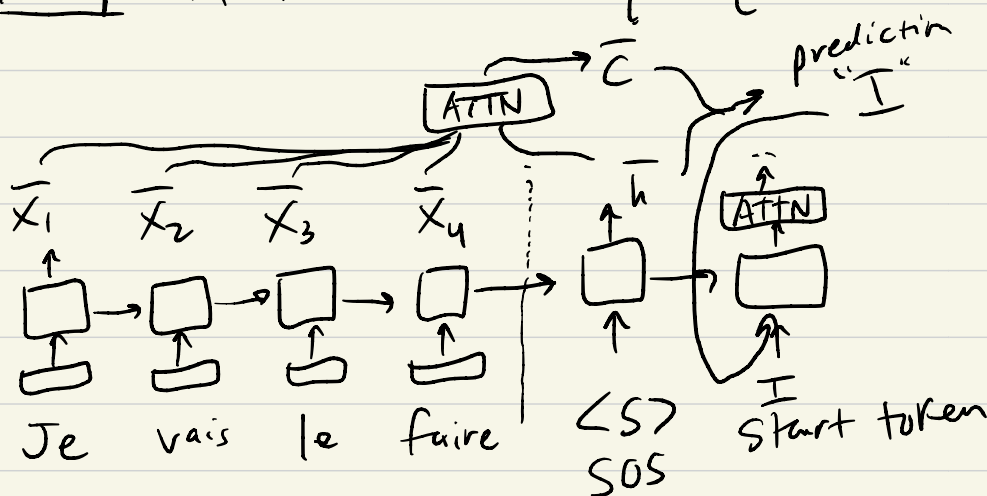


# CS 378 Lecture 21

## Today

- QA intro
- Knowledge base QA
- Semantic parsing
- Combinatory Categorical grammar (CCG)

## Recap Attention in seq2seq models



attention weights (probs)  $\alpha = \text{softmax}_i(\bar{h}^T W \bar{x}_i)$

$$\bar{c} = \sum \alpha_i \bar{x}_i$$

Je    vais    le    faire

## Announcements

- A5 due Thursday
  - Final proj
- 
- 

## Question Answering

① When was Samuel L Jackson born?  
"factoid" question

How to answer? Use a knowledge base

question → query in a formal language → execute that to get answer

② Who is Iron Man?

want a summary / description  
information retrieval (IR)

X out of scope

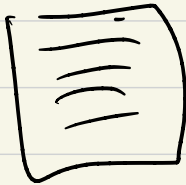
③ Who was the villain in Iron Man 1?

Some where in the middle

Knowledge base probably doesn't have  
"movie villains"

But there is a short answer!

Solution: combination of IR (fetch  
relevant webpages) + extract info

Q → Google → 

<sup>Answer</sup>  
Obadiah Stane...  
... serves as the  
main antagonist  
in Iron Man 1.

Final project

Today: Question #1

# Knowledge Base QA

- ① Convert question to a formal semantic representation
- ② Execute that against a KB

KB: database of info

<u>name</u>	<u>birthday</u>	<u>movies</u>
Samuel L Jackson	12/21/48	Pulp Fiction, Captain Marvel, ...
Brie Larson	10/1/89	Captain Marvel, ...

How to do this with python?

map( $\lambda r: r.bday$ , filter( $\lambda r: r.name = \text{"Samuel L Jackson"}$ ))  
↙ rows

Goal: map from Q to this piece of code

Use a formal representation called  
lambda calculus

$\lambda d. \text{ bday}(d, \text{ Samuel L Jackson})$   
           $\uparrow$   
          predicate

What movies did Brie Larson star in?

$\lambda m. \text{ movie}(m) \wedge \text{ Stars In}(m, \text{ Brie Larson})$