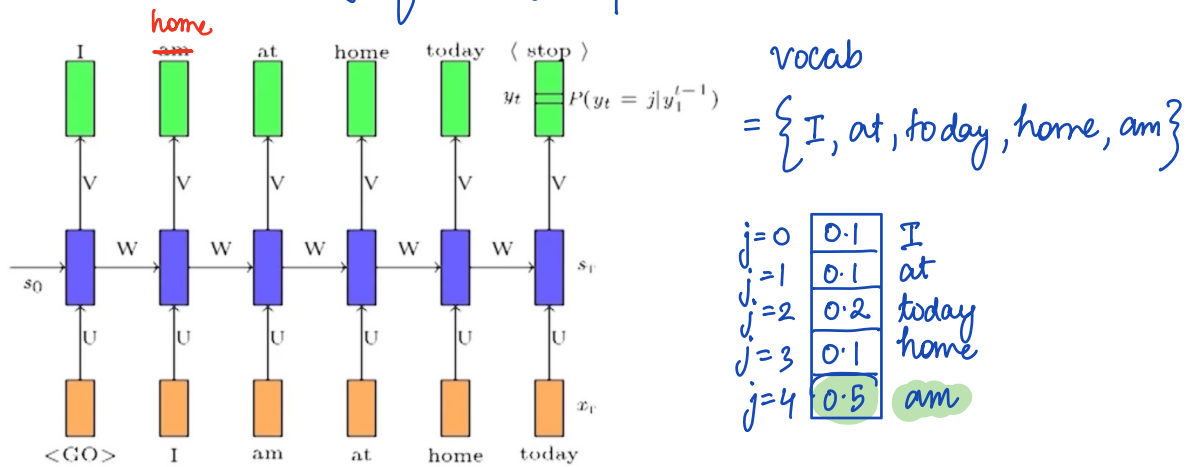


Let's revisit the task of auto completion.



At any time step  $t$ , we want to compute

$$\arg \max_{j \in V} P(y_t = j | y_{t-1}, y_{t-2}, \dots, y_1)$$

word      Vocabulary

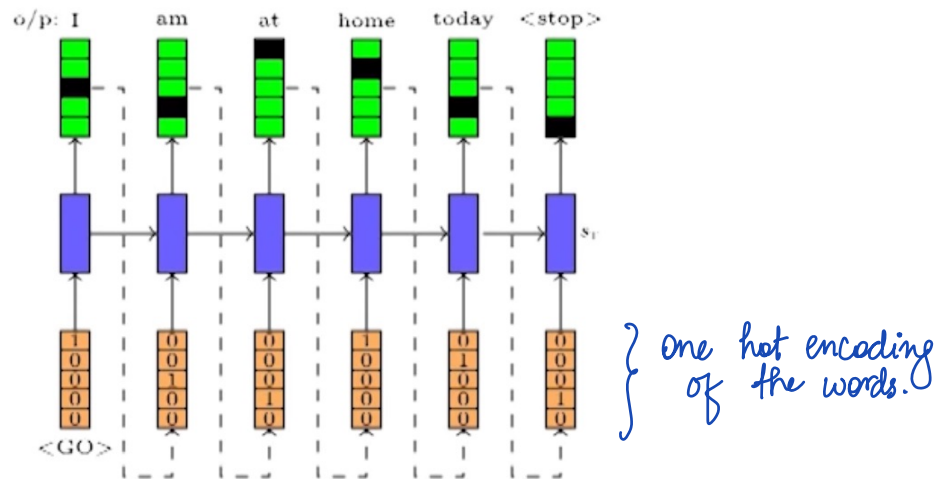
eg.  $P(y_4 = home | at, am, I)$

Using RNN,

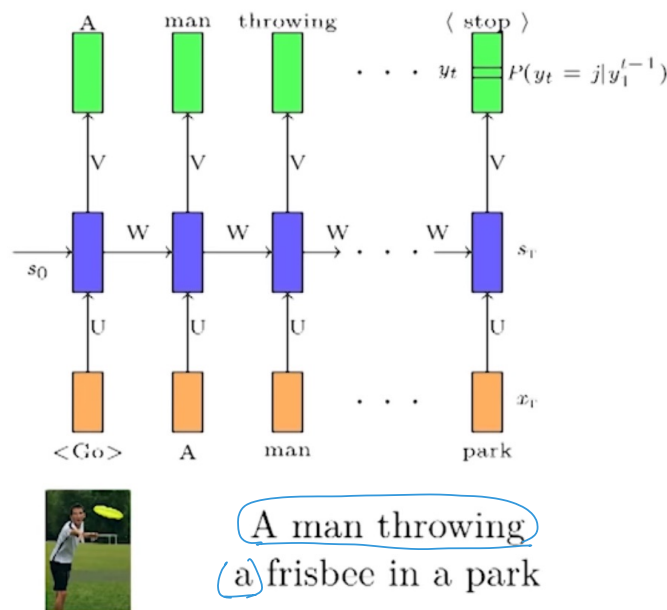
$$P(y_t = j | y_{t-1}, y_{t-2}, \dots, y_1) = \left( \text{softmax}(V s_t + c) \right)_j$$

$s_t$  captures all the information until time step  $t$ .

At test time,



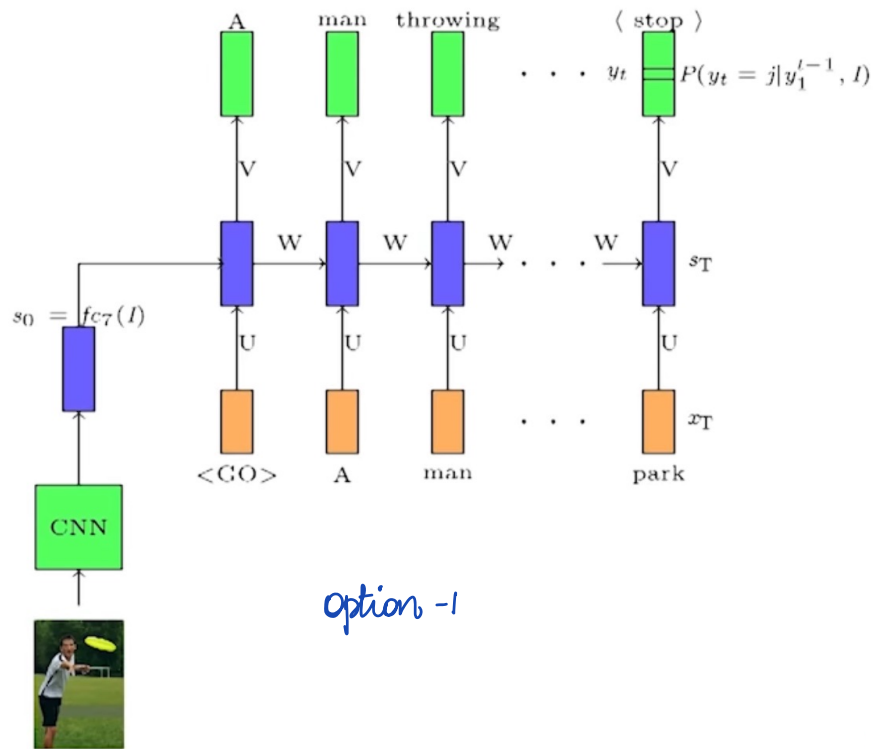
## Image Captioning



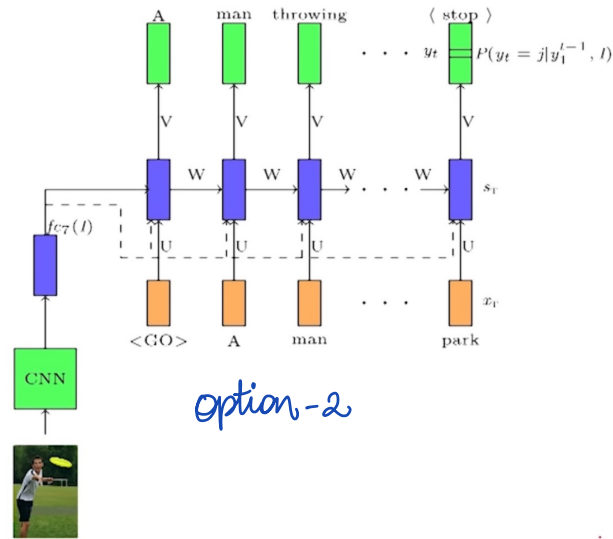
9:05 AM

We want to generate a sentence given an image.  $\rightarrow$  Image.  
We are interested in  $P(y_t = j | y_1, \dots, y_{t-1}, I)$

Since CNN architectures are good for images, we use it to learn important features from the image and then pass it on to the RNN model.

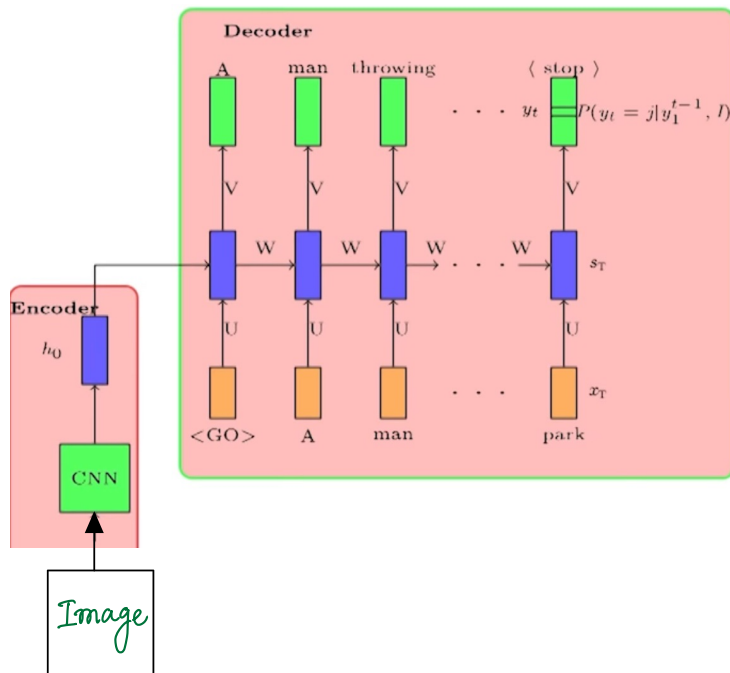


option -1



option-2

## Encoder - Decoder



In image captioning,

A CNN is used to "encode" the image

- Learn good feature representation of the input.

An RNN is used to "decode" a sentence from this encoding.

Task: Image Captioning

Data:  $\{x_i = \text{image}, y_i = \text{caption}\}_{i=1}^N$

Model:

Encoder

$$s_0 = \text{CNN}(x_i)$$

Decoder

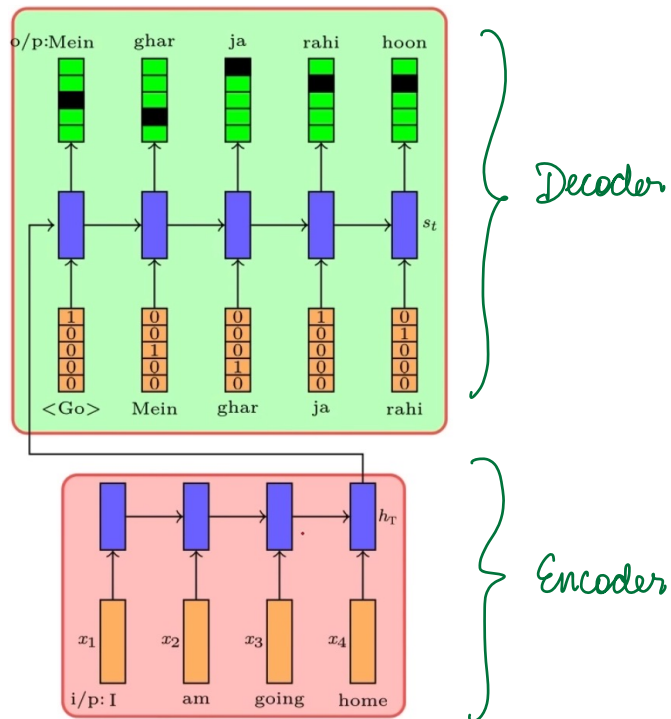
$$s_t = \text{RNN}(s_{t-1}, y_{t-1})$$

Parameters:  $U, V, W, b, c$  of CNN. and all weights and biases

Training all parameters of encoder and decoder together.

- End to end model

## Machine Translation



## Video Captioning

