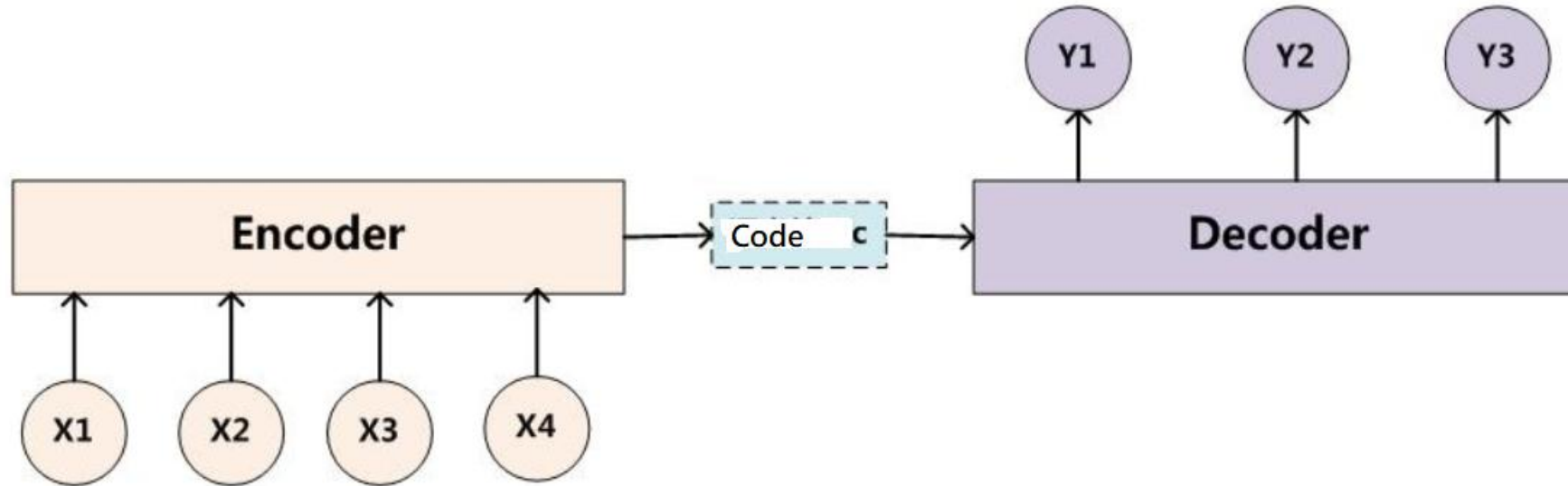


ATTENTION MODEL (AM)

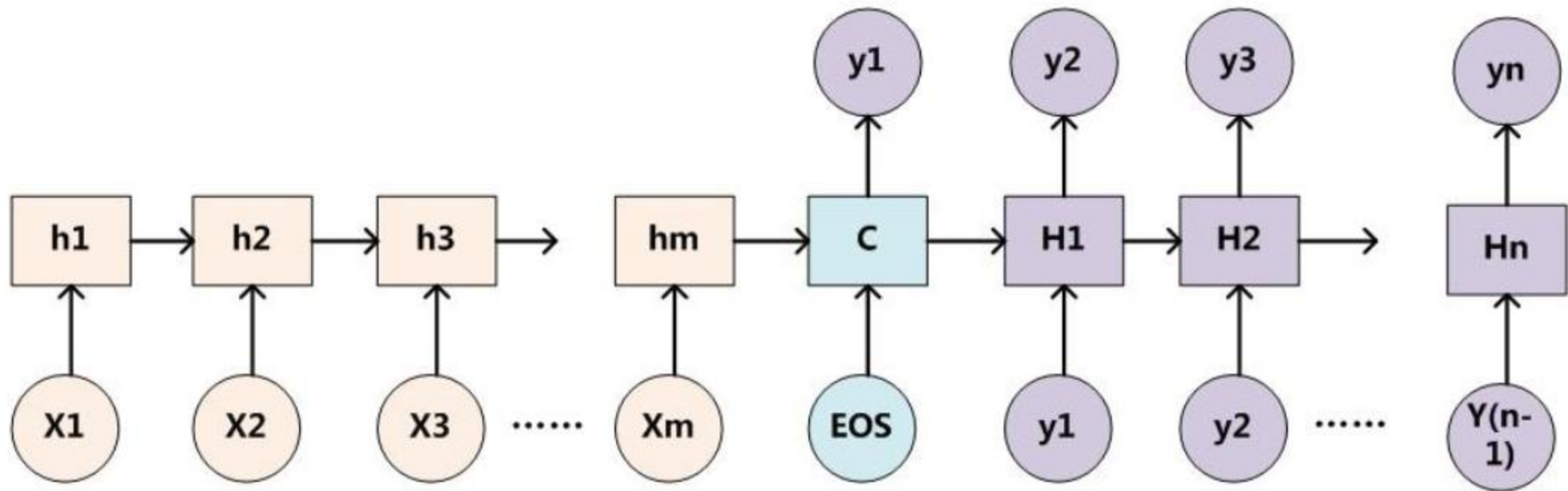
- **Why attention model**
- **Attention Model**
- **Bi-directional RNN**

- Adapted [張俊林](#)

- Encoder-Decoder model for seq2seq translation



- The details—RNN encoder-decoder



- Problem: same code c is used for all y_i
- Assume that

$$\mathbf{X} = \langle x_1, x_2 \dots x_m \rangle$$

$$\mathbf{Y} = \langle y_1, y_2 \dots y_n \rangle$$

- Intermediate code C
- depends on x_i

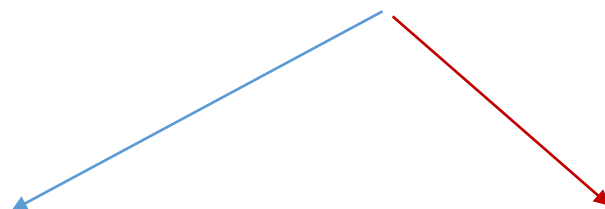
$$C = \mathcal{F}(x_1, x_2 \dots x_m)$$

- To decode y_i we use the same code C

$$y_i = \mathcal{G}(C, y_1, y_2 \dots y_{i-1})$$

- Of course with y_1, y_2, \dots, y_{i-1}

- No attention in this case:



- To translate

- Tom chase Jerry → “湯姆” “追” “傑瑞”

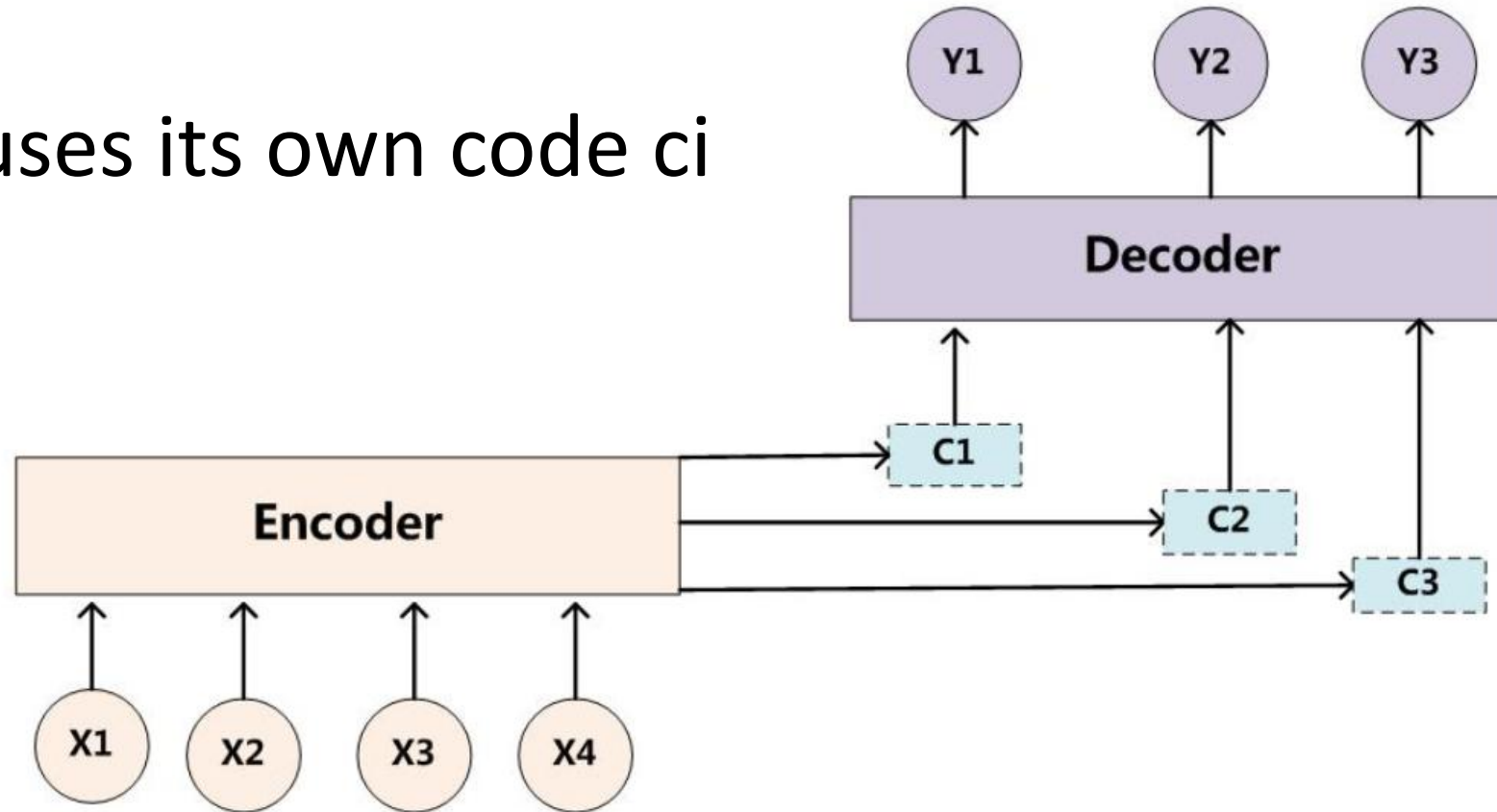
We should focus more on “Jerry” when translate it into “傑瑞”

So we want a probability distribution of importance such as

(Tom,0.3) (Chase,0.2)(Jerry,0.5)

Attention Model (AM)

Each y_i uses its own code c_i



That is,

$$y_1 = f_1(C_1)$$

$$y_2 = f_1(C_2, y_1)$$

$$y_3 = f_1(C_3, y_1, y_2)$$

- How to find c_i : weighted-sum of the component hidden state

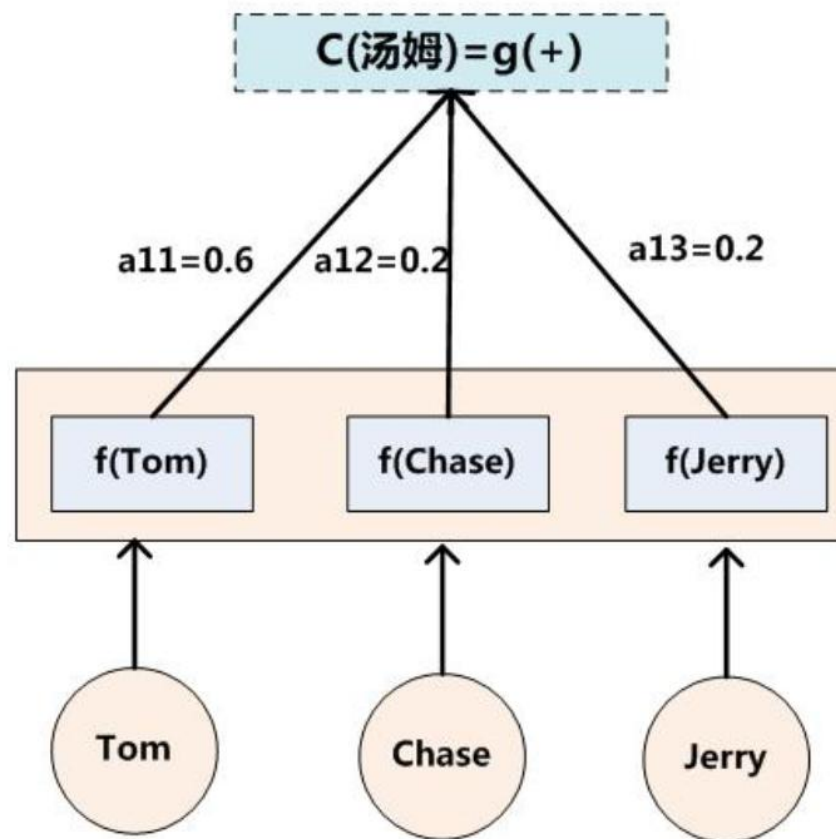
$$C_{\text{汤姆}} = g(0.6 * f2(\text{"Tom"}), 0.2 * f2(\text{Chase}), 0.2 * f2(\text{"Jerry"}))$$

$$C_{\text{追逐}} = g(0.2 * f2(\text{"Tom"}), 0.7 * f2(\text{Chase}), 0.1 * f2(\text{"Jerry"}))$$

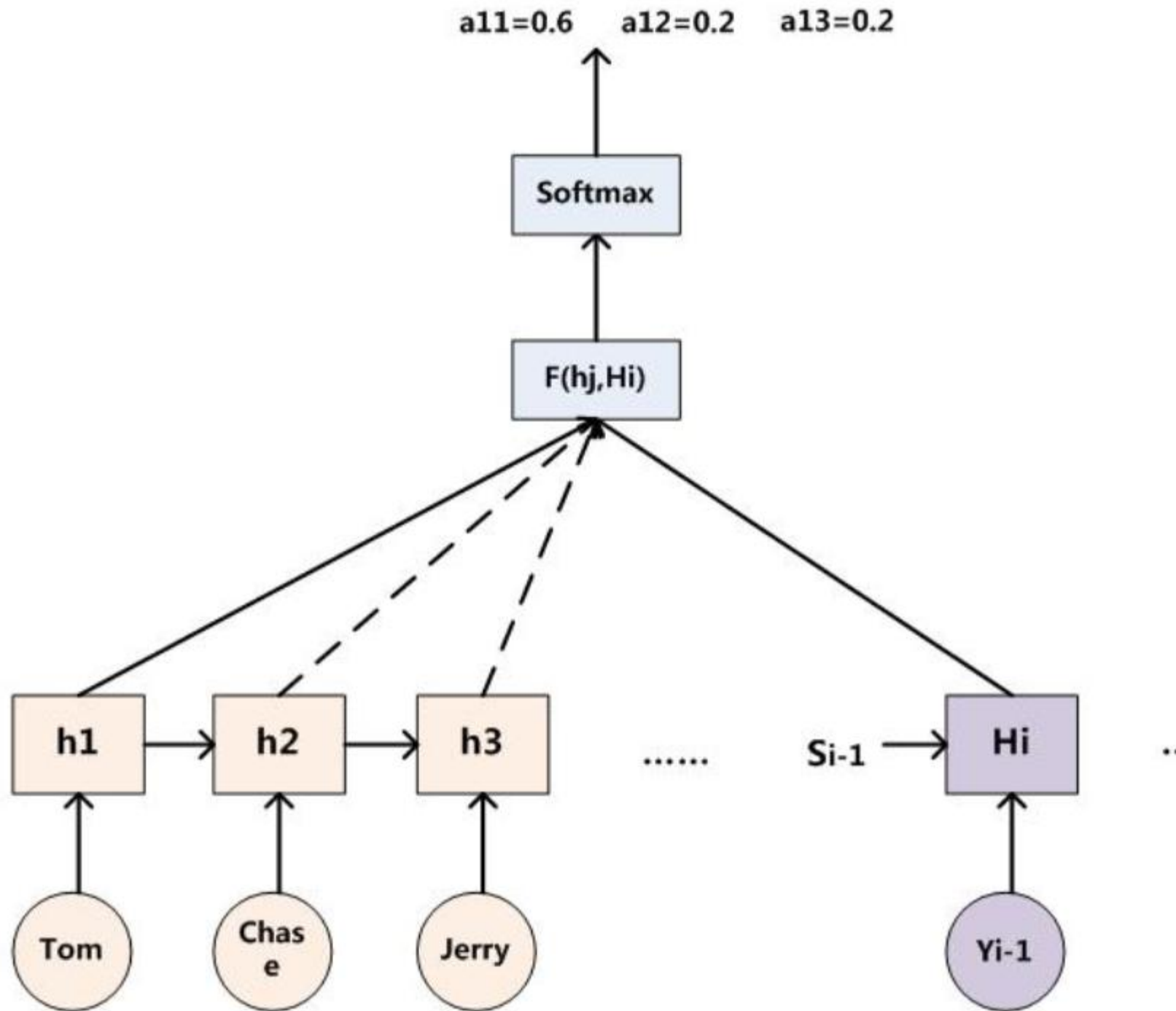
$$C_{\text{杰瑞}} = g(0.3 * f2(\text{"Tom"}), 0.2 * f2(\text{Chase}), 0.5 * f2(\text{"Jerry"}))$$

- f2 for RNN will encode x_i into its hidden state h_i ; every c_i has its own α_i

$$c_i = \sum_{j=1}^{T_x} \alpha_{ij} h_j$$

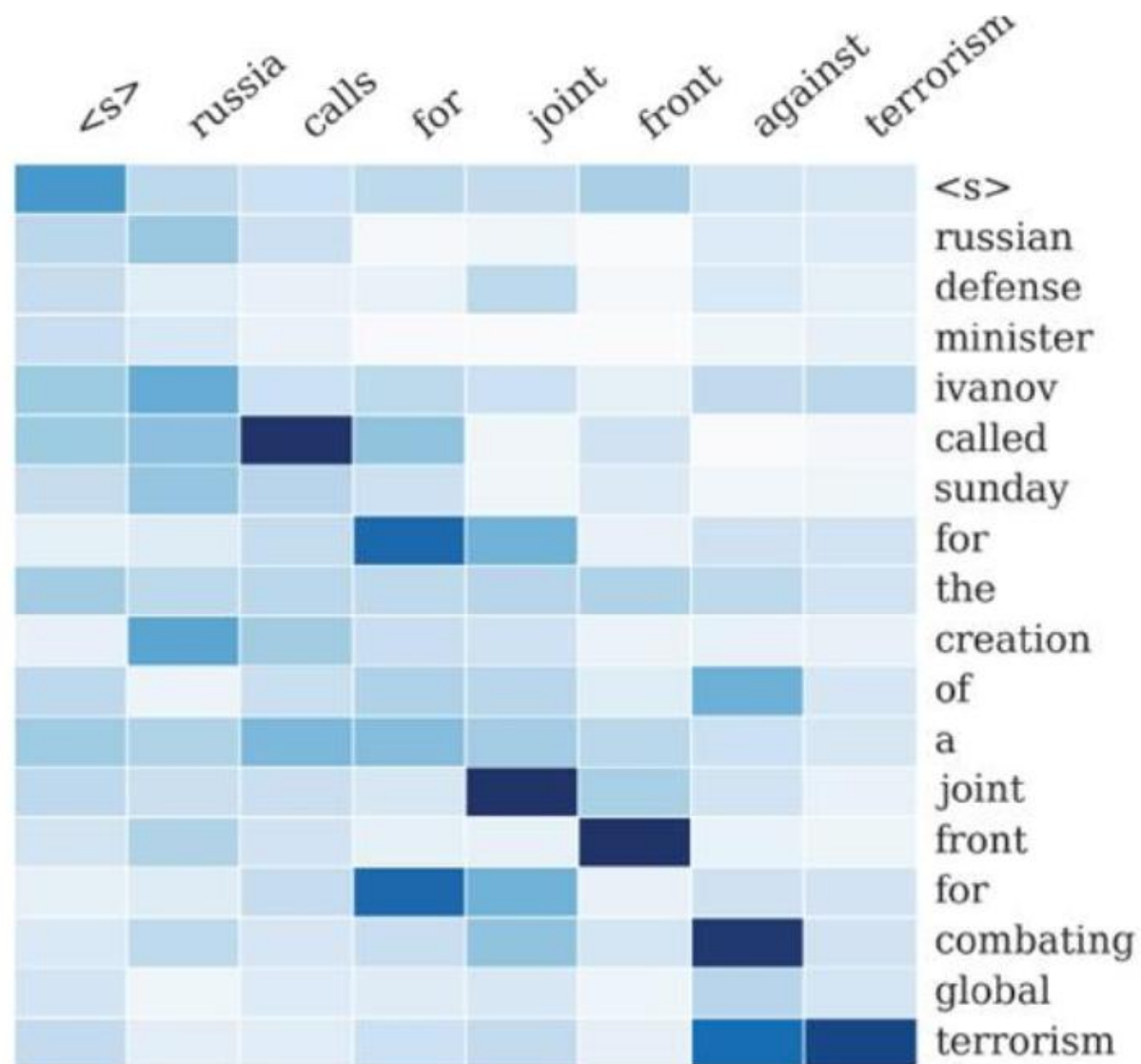


- How to find attent probabilities?
- Use pair of h_j and H_i and find F
- F depends on different applications



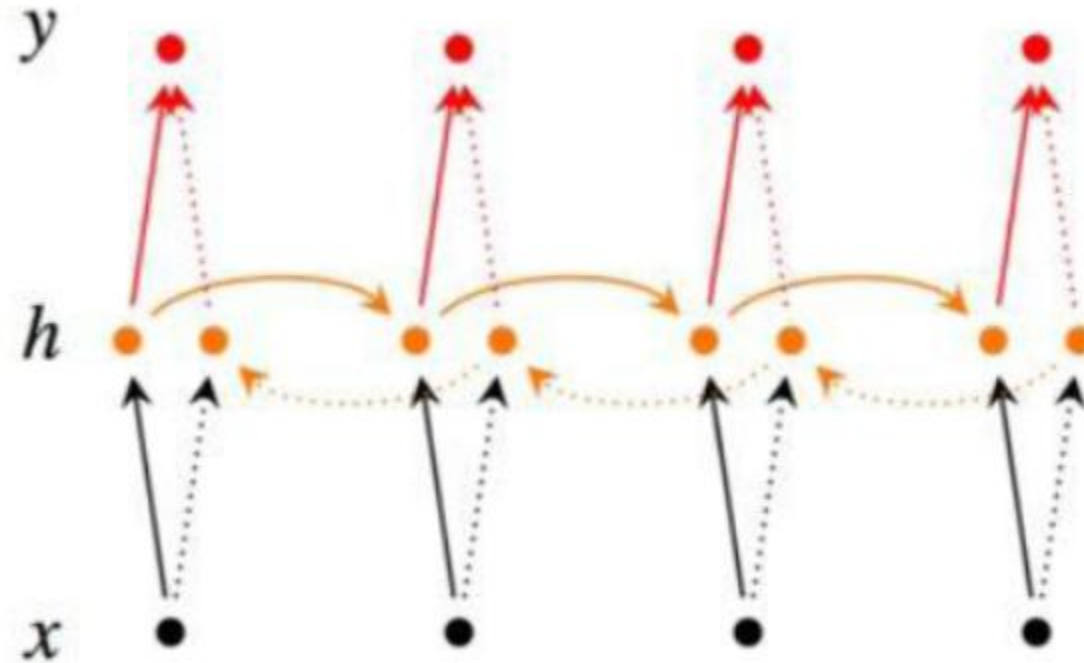
- Attention also called alignment (aligned on focus point)
- [Attention link](#)

Attention for summarization



Bi-directional RNN

Output depends on both
prefix and suffix



- h^1 forward, h^2 backward

$$h_i^1 = f(U^1 * X_i + W^1 * h_{i-1})$$

$$h_i^2 = f(U^2 * X_i + W^2 * h_{i-1})$$

$$y_i = \text{softmax}(V * [h_i^1; h_i^2])$$

- From beginners to experts in deep learning