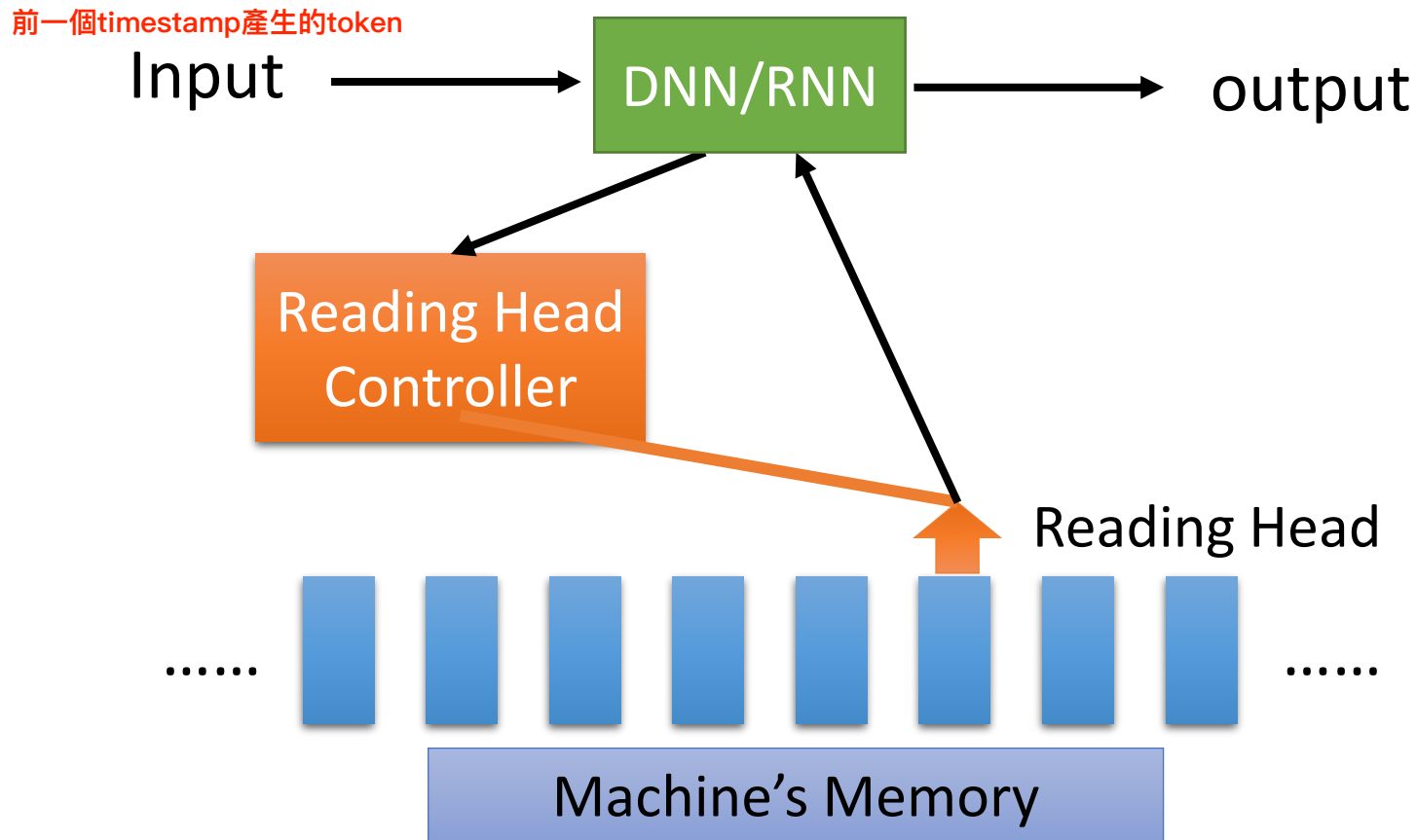


Attention-based Model

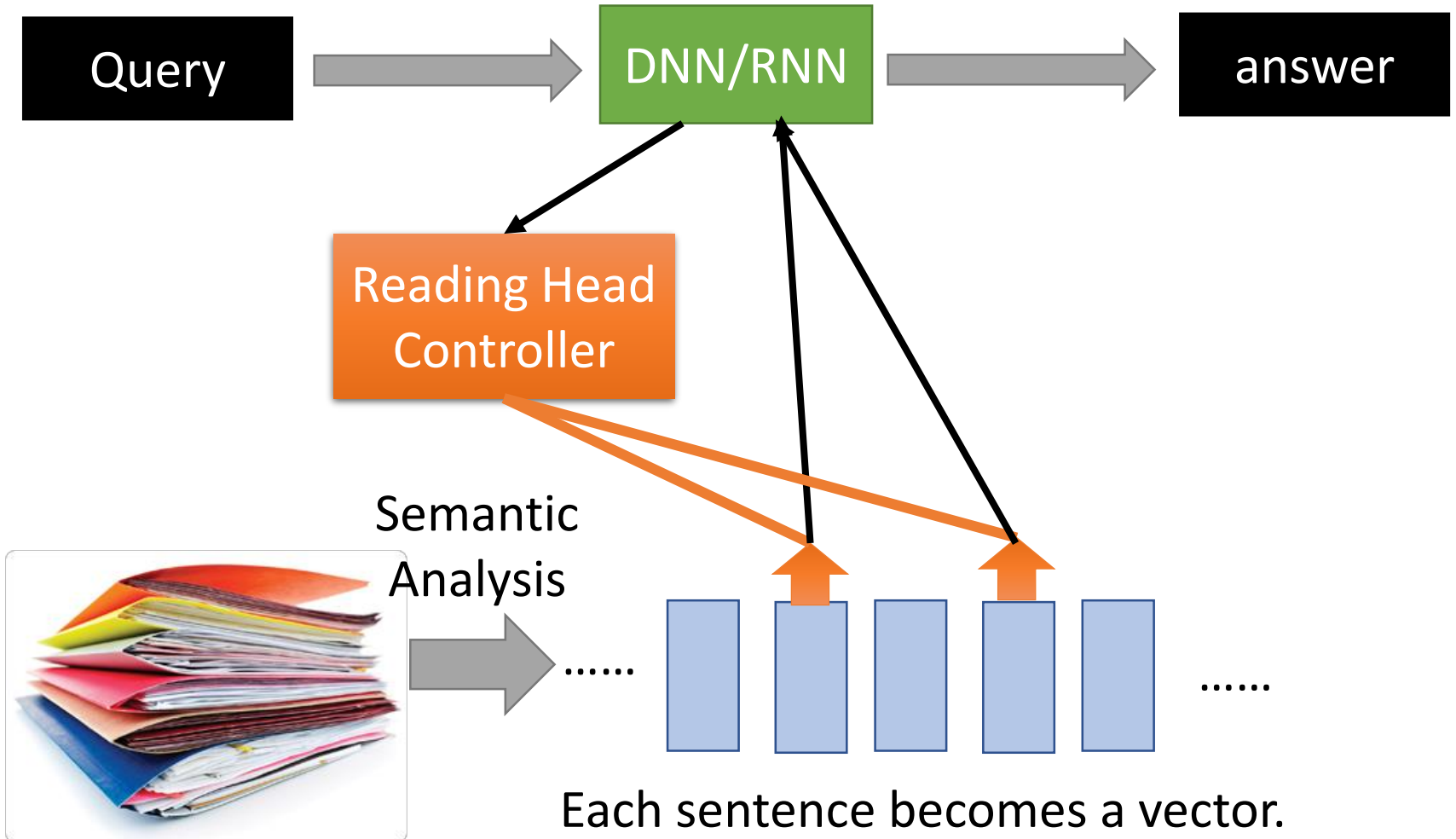
External Memory



Ref:

[http://speech.ee.ntu.edu.tw/~tlkagk/courses/MLDS_2015_2/Lecture/Attain%20\(v3\).ecm.mp4/index.html](http://speech.ee.ntu.edu.tw/~tlkagk/courses/MLDS_2015_2/Lecture/Attain%20(v3).ecm.mp4/index.html)

Reading Comprehension



SQUAD – attention based model completion like Kaggle

Memory Network

假設又抽出資料的vector跟算match的vector相同

Sentence to vector can be jointly trained.

Extracted Information

$$\text{Extracted Information} = \sum_{n=1}^N \alpha_n x^n$$

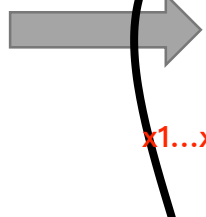


DNN



Answer

Document



α_1 α_2 α_3 α_N
 x^1 x^2 x^3 x^N

$x^1 \dots x^N$ 為 bag of word 做 dimension reduction 後的 output vector

Match
cosine similarity

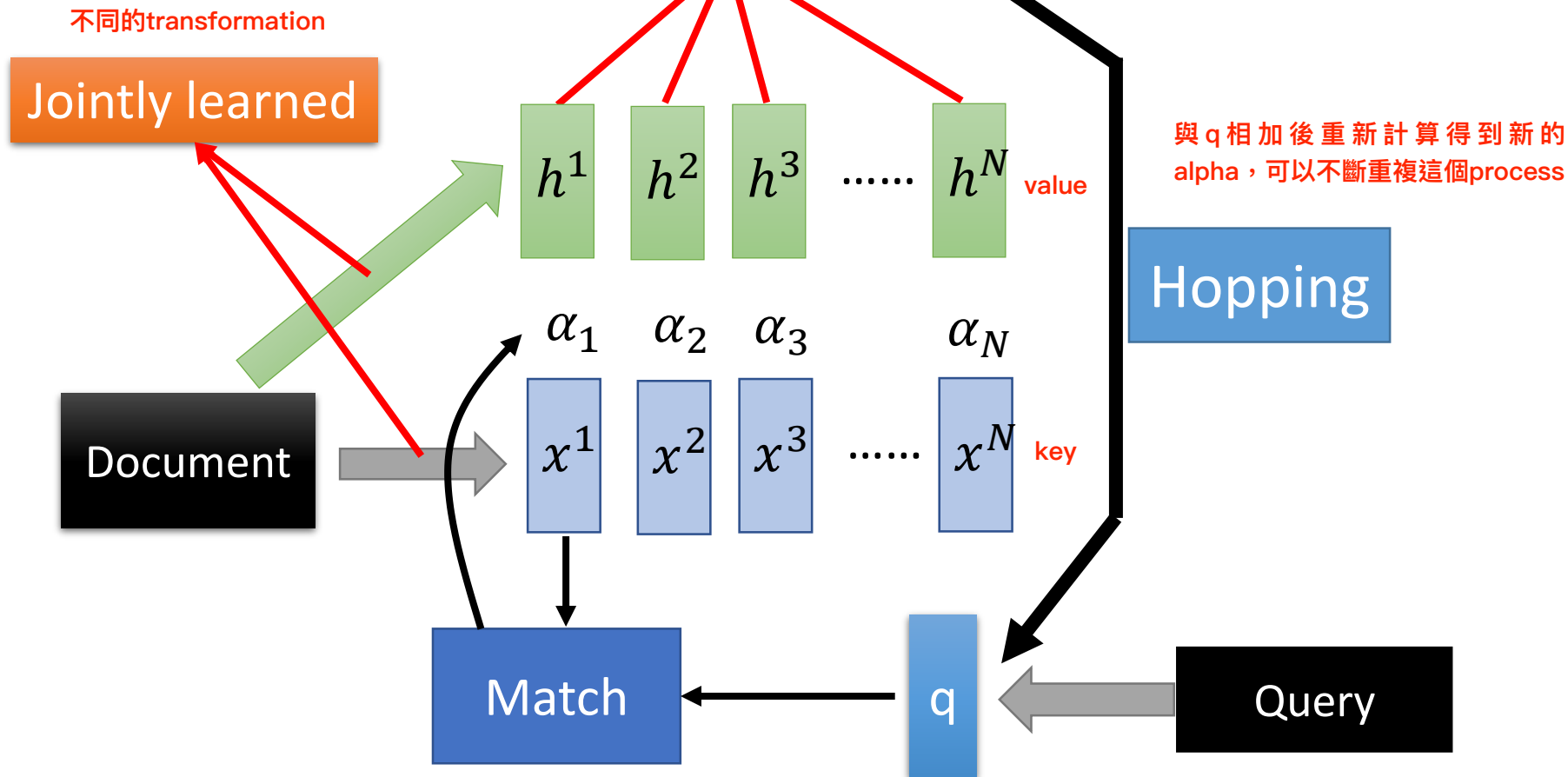
q



Query

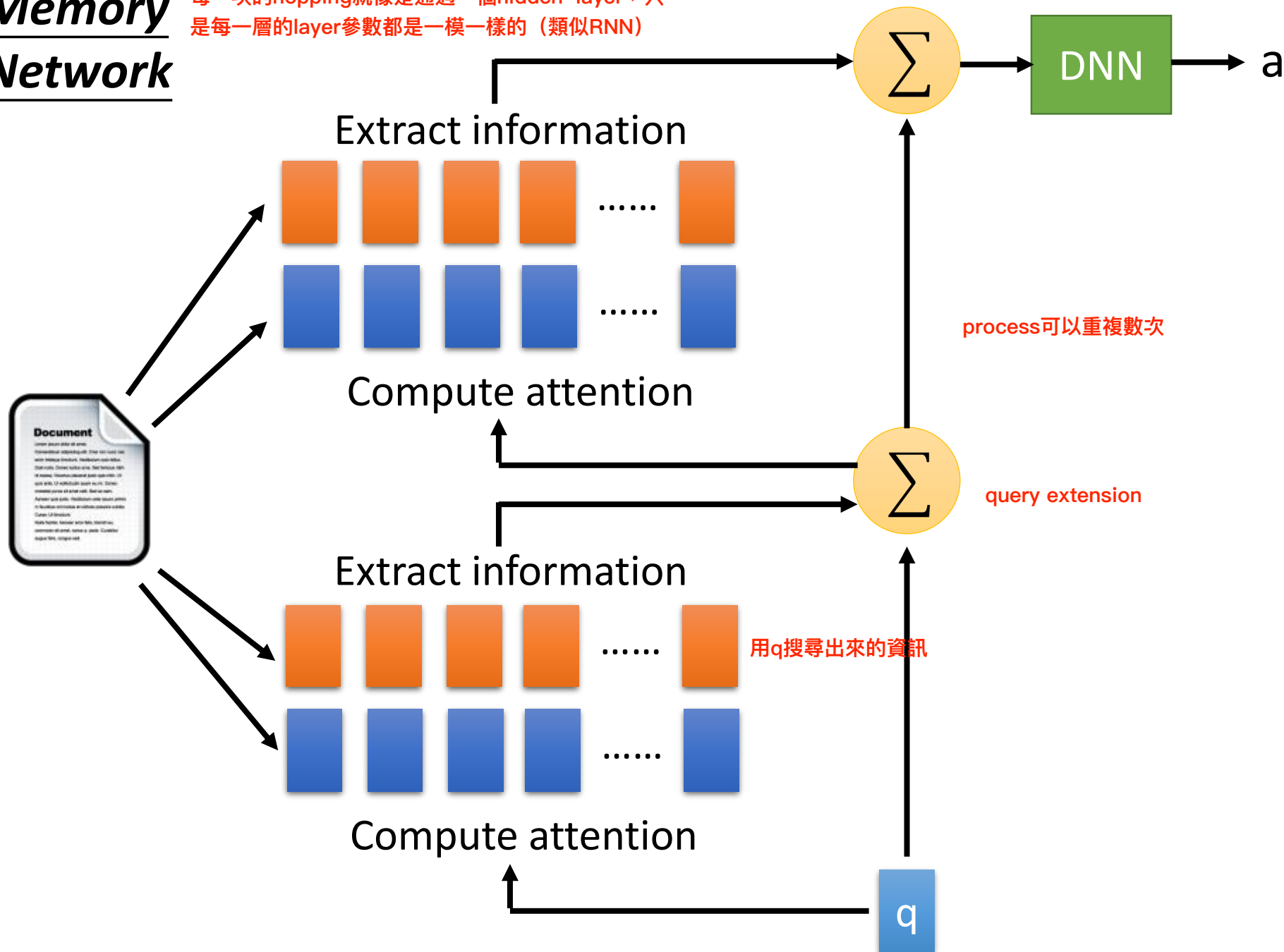
Memory Network

假設又抽取出資料的vector跟算match的vector不同



Memory Network

每一次的hopping就像是通過一個hidden layer，只是每一層的layer參數都是一模一樣的（類似RNN）



新的paper

R-Net (by Microsoft)

Di-directional Attention Flow

Fully-Aware Fusion Network

Multiple-hop

ReasoNet, 要做幾次hop是machine自己決定的

<https://arxiv.org/abs/1609.05284>

- End-To-End Memory Networks. S. Sukhbaatar, A. Szlam, J. Weston, R. Fergus. NIPS, 2015.

The position of reading head:

position of reading head

		attention weight		
Story (16: basic induction)	Support	Hop 1	Hop 2	Hop 3
Brian is a frog.	yes	0.00	0.98	0.00
Lily is gray.		0.07	0.00	0.00
Brian is yellow.	yes	0.07	0.00	1.00
Julius is green.	yes	0.06	0.00	0.00
Greg is a frog.		0.76	0.02	0.00
What color is Greg? Answer: yellow Prediction: yellow				

Keras has example:

https://github.com/fchollet/keras/blob/master/examples/babi_memnn.py

Visual Question Answering



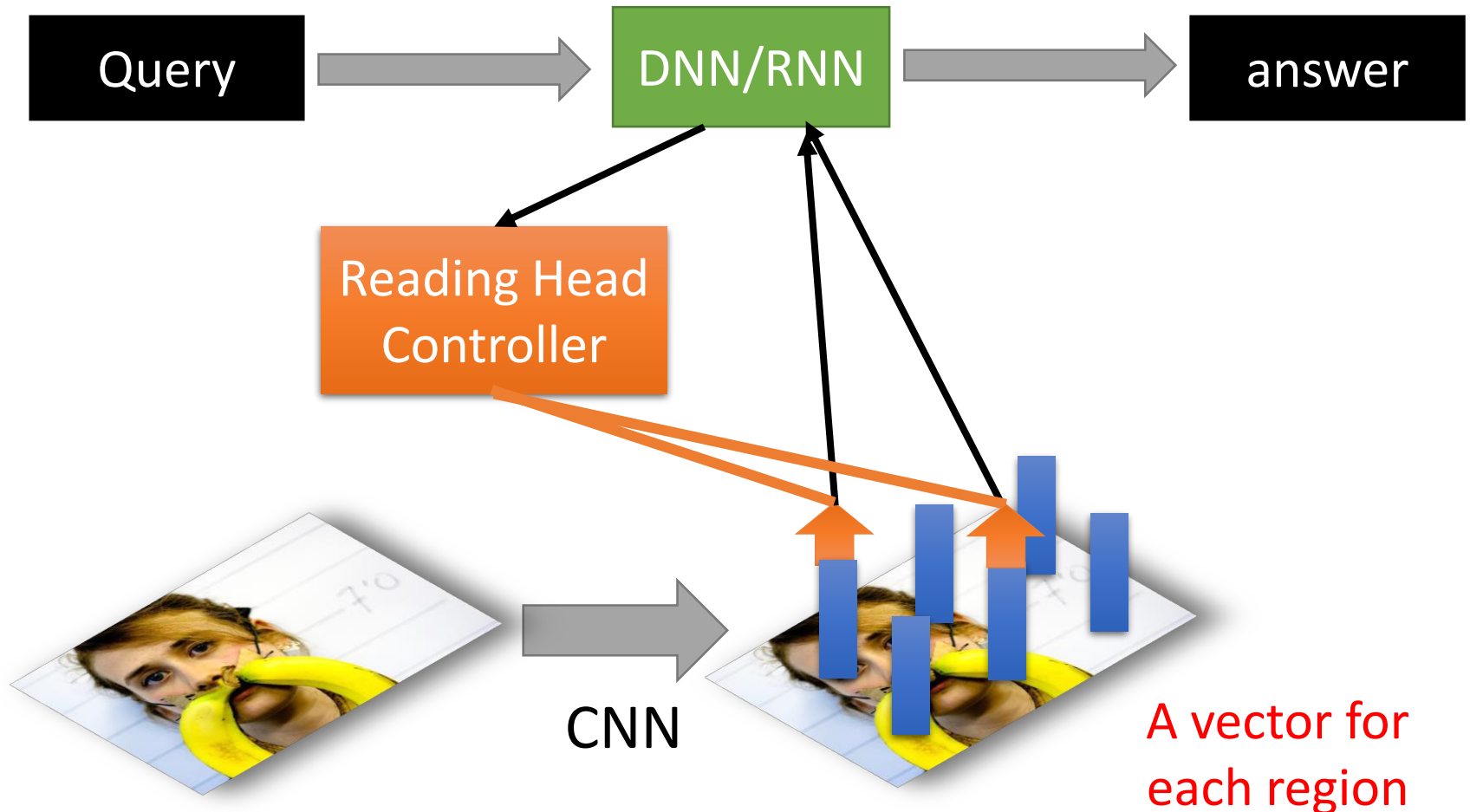
What is the mustache
made of?

AI System

bananas

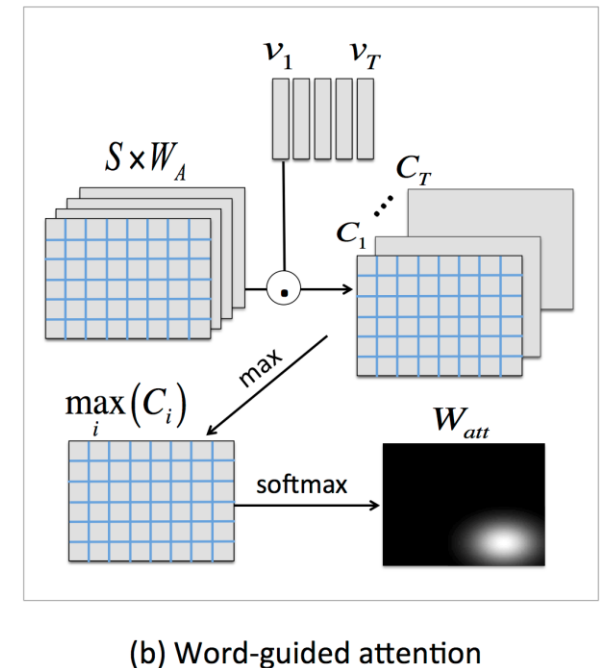
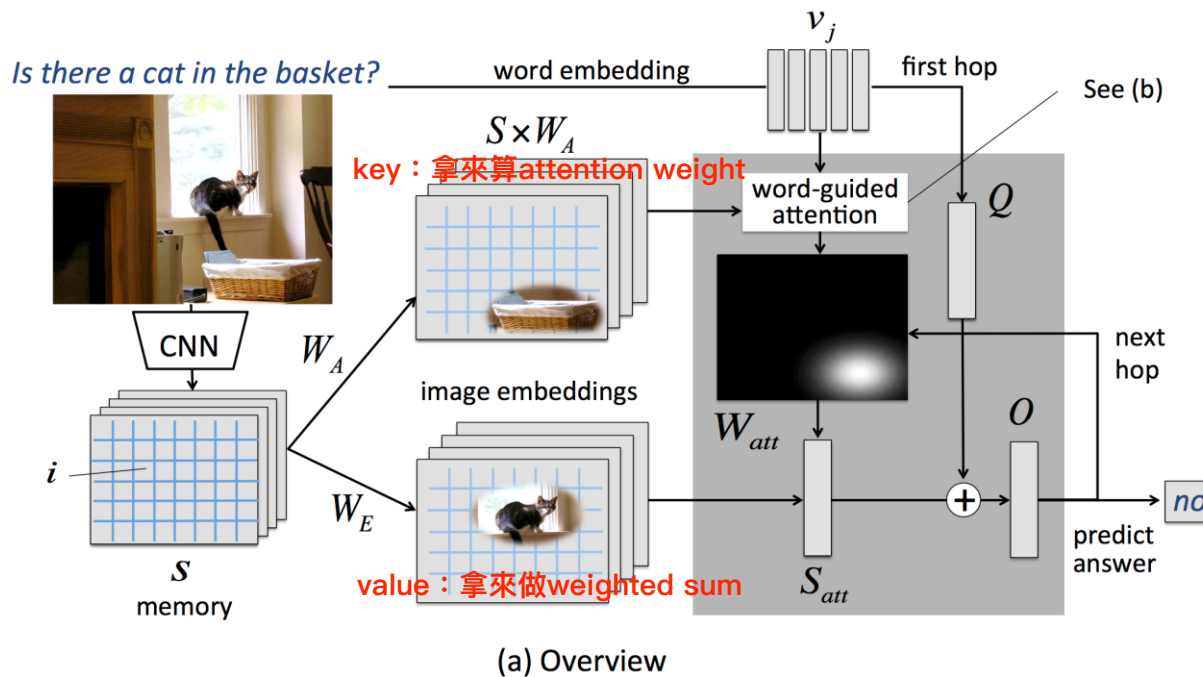
source: <http://visualqa.org/>

Visual Question Answering



Visual Question Answering

- Huijuan Xu, Kate Saenko. Ask, Attend and Answer: Exploring Question-Guided Spatial Attention for Visual Question Answering. arXiv Pre-Print, 2015



Visual Question Answering

- Huijuan Xu, Kate Saenko. Ask, Attend and Answer: Exploring Question-Guided Spatial Attention for Visual Question Answering. arXiv Pre-Print, 2015

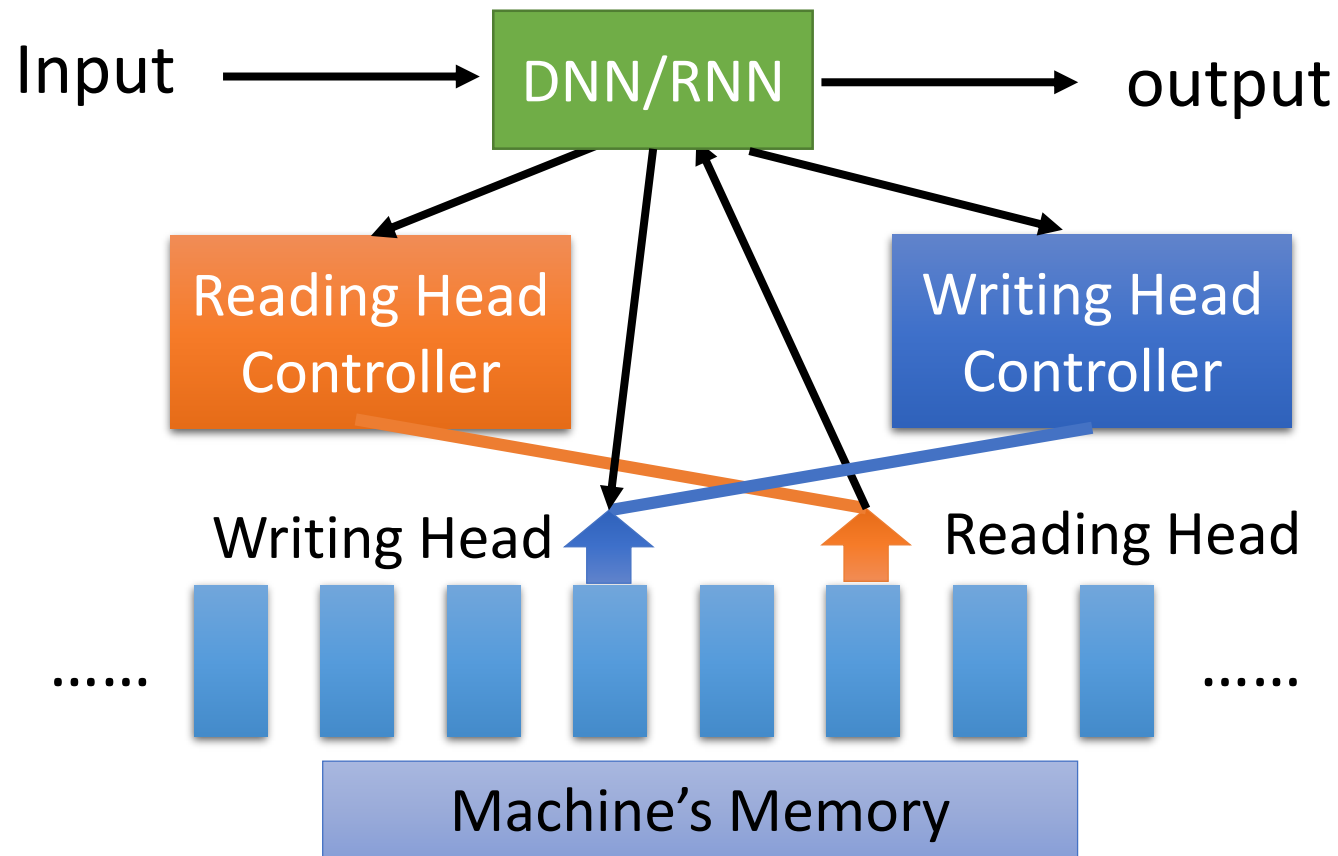
Is there a red square on the bottom of the cat?

GT: yes

Prediction: yes



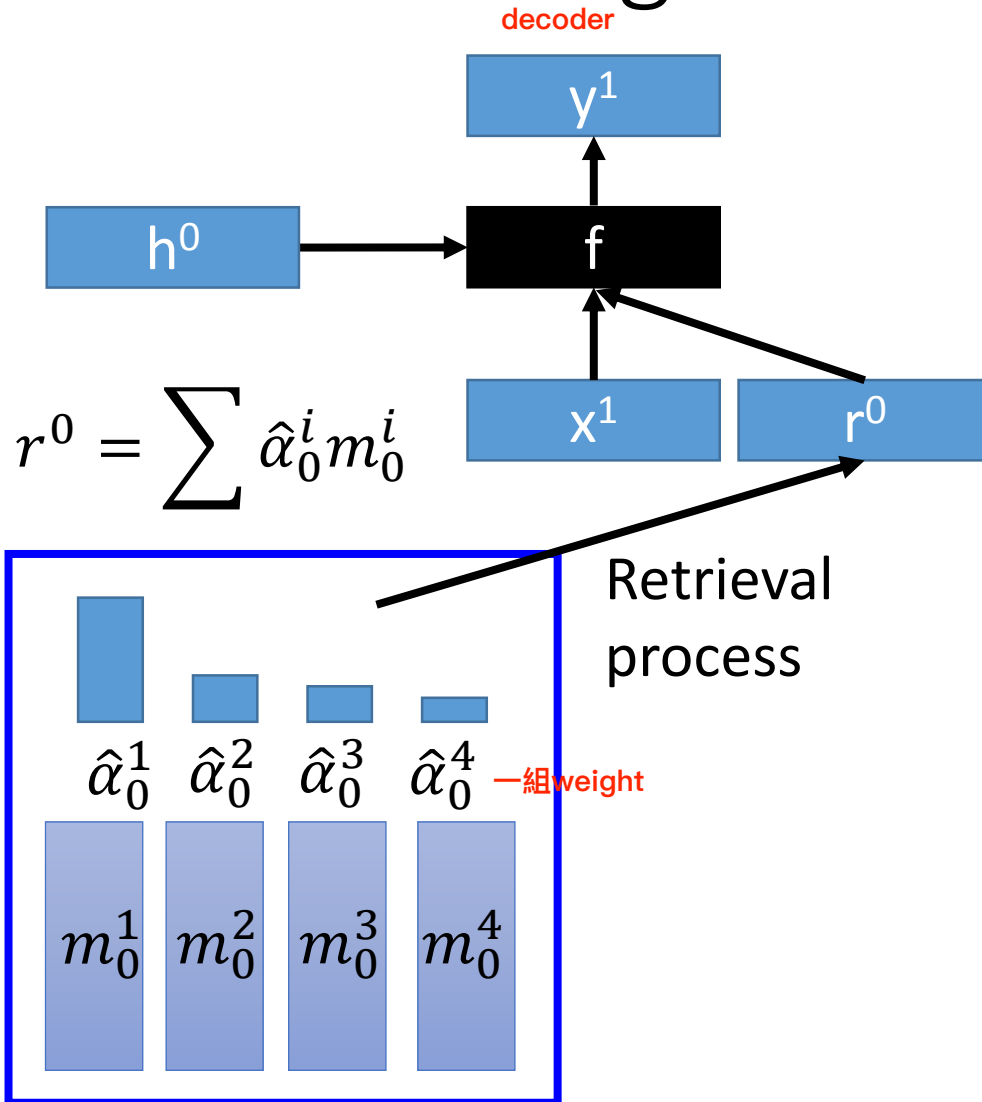
External Memory v2



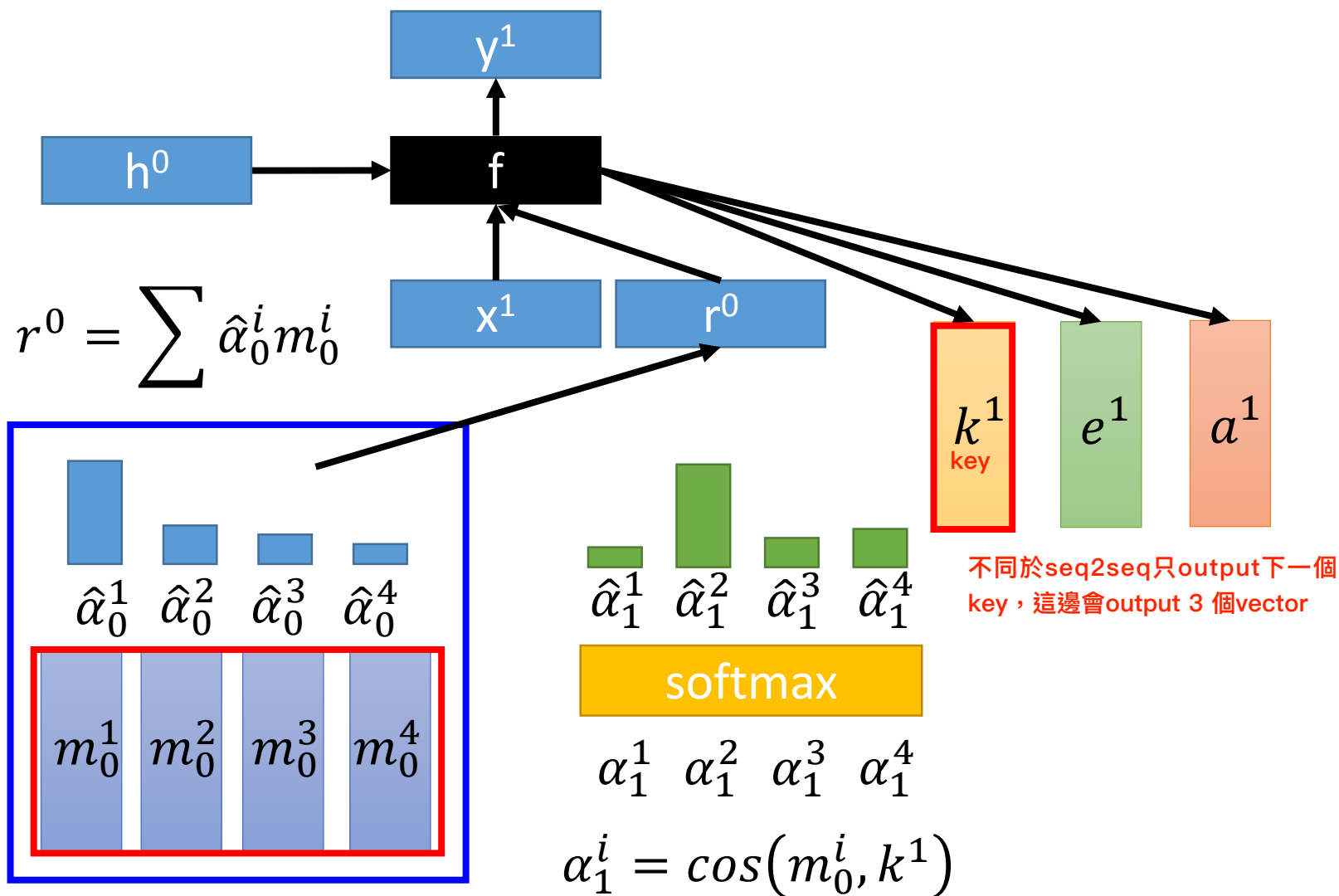
Neural Turing Machine

不只去讀machine mem.還可以去改寫

Neural Turing Machine



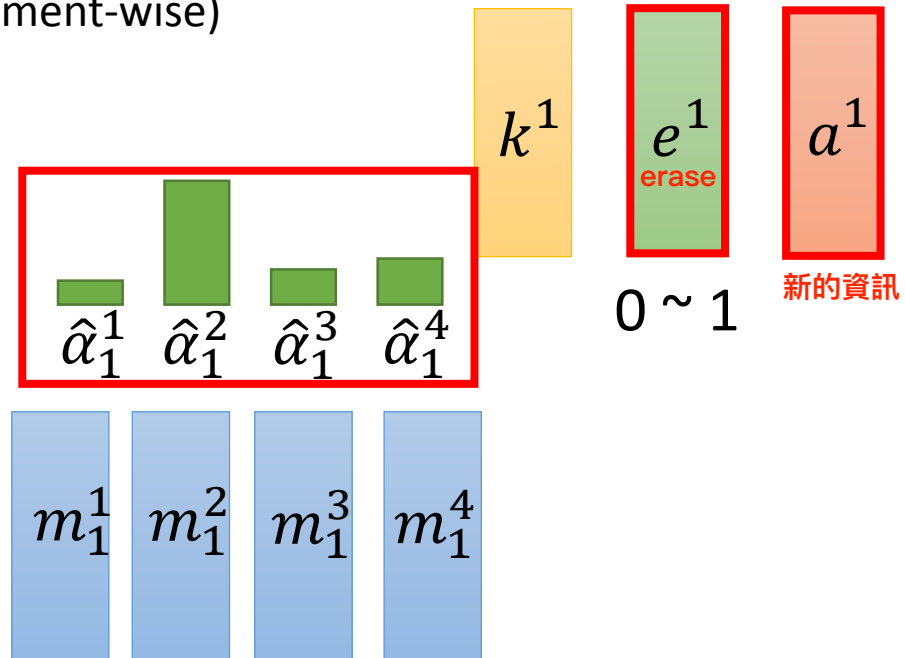
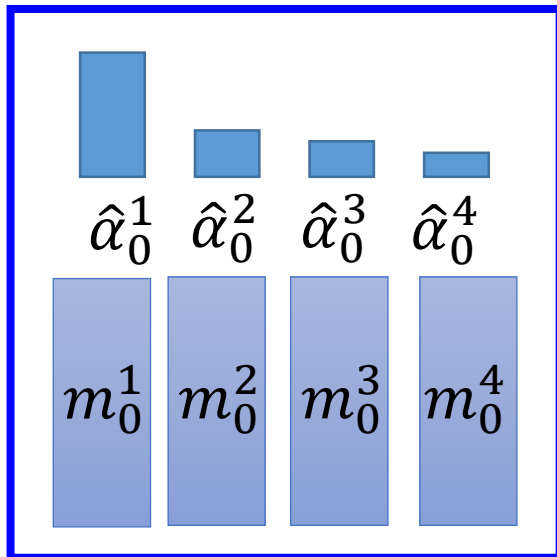
Neural Turing Machine



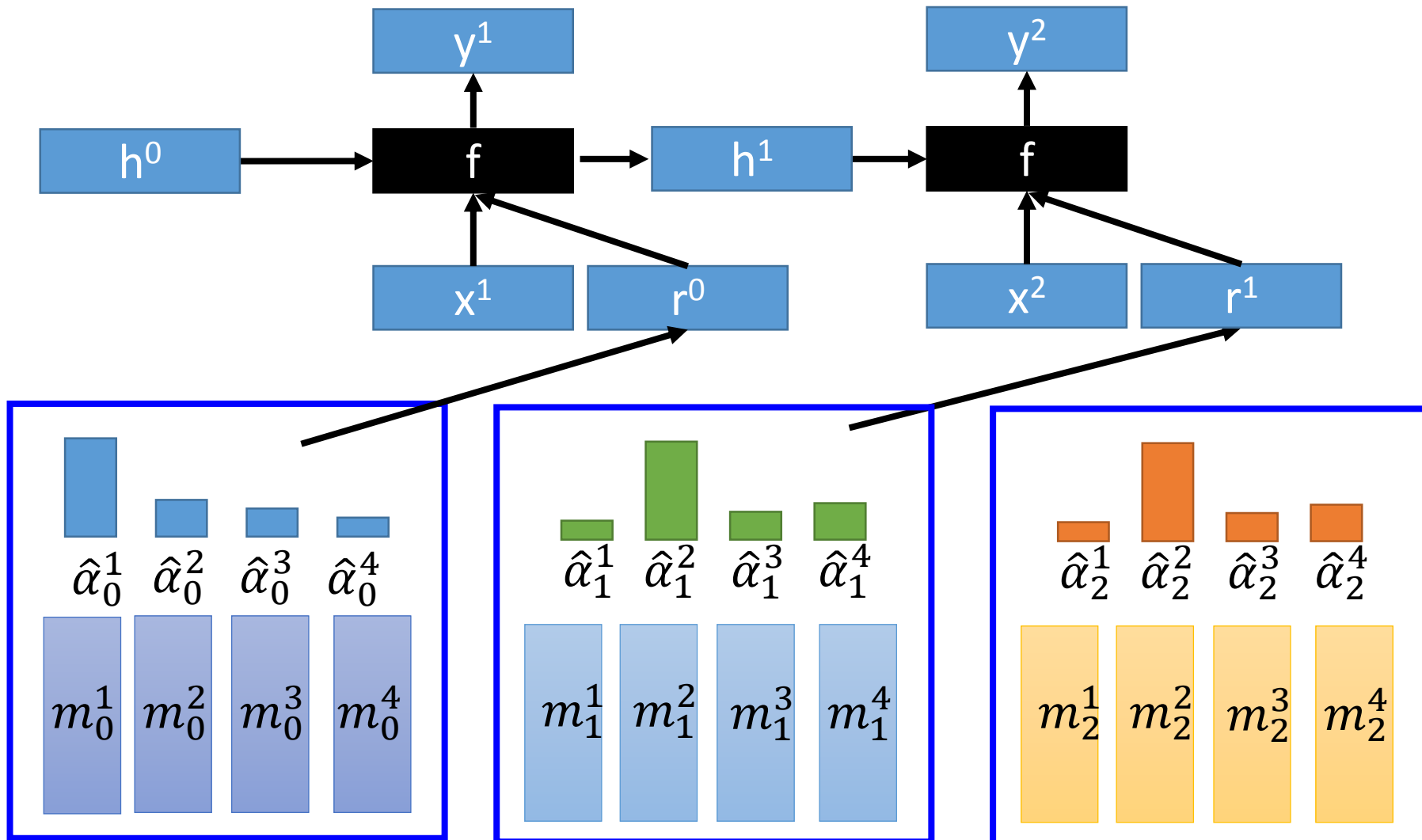
Neural Turing Machine

$$m_1^i = m_0^i - \hat{\alpha}_1^i e^1 \odot m_0^i + \hat{\alpha}_1^i a^1$$

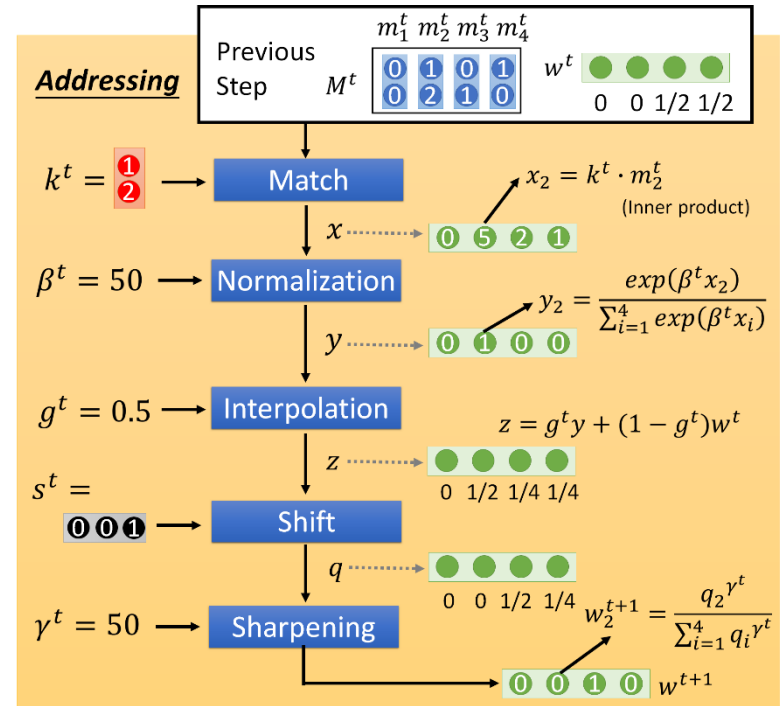
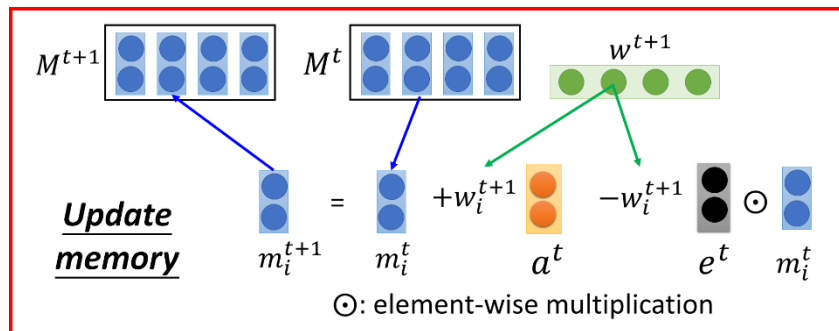
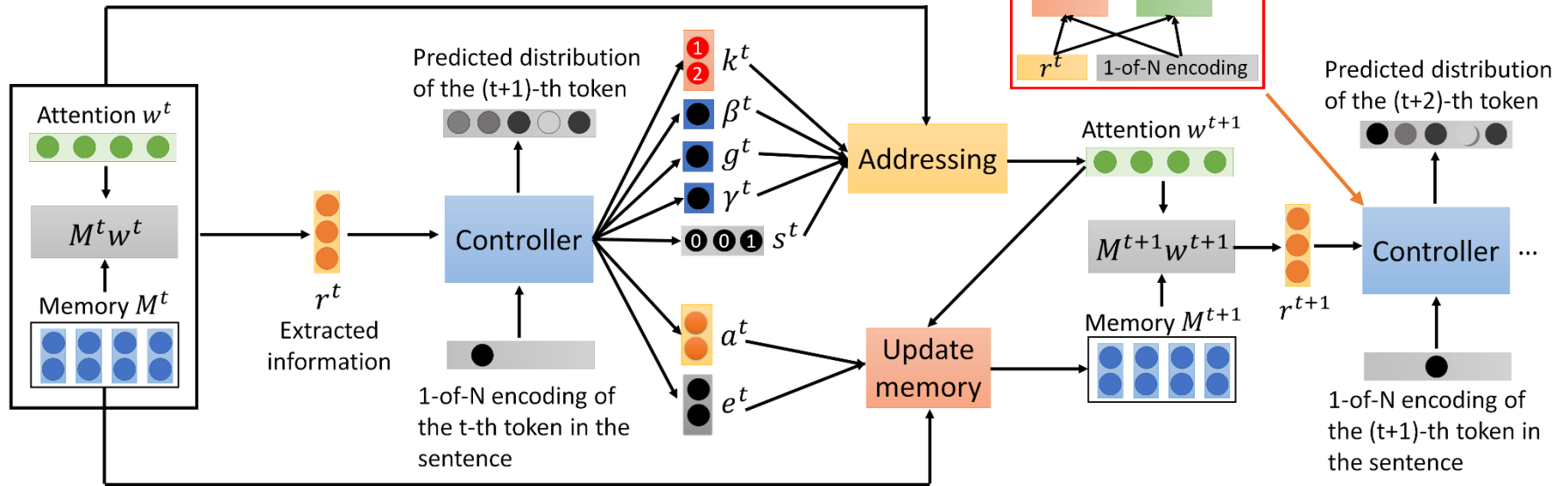
(element-wise)



Neural Turing Machine



Neural Turing Machine for LM



Wei-Jen Ko, Bo-Hsiang Tseng, Hung-yi Lee,
 “Recurrent Neural Network based Language
 Modeling with Controllable External Memory”,
 ICASSP, 2017

Stack RNN

