Self-Supervised Learning

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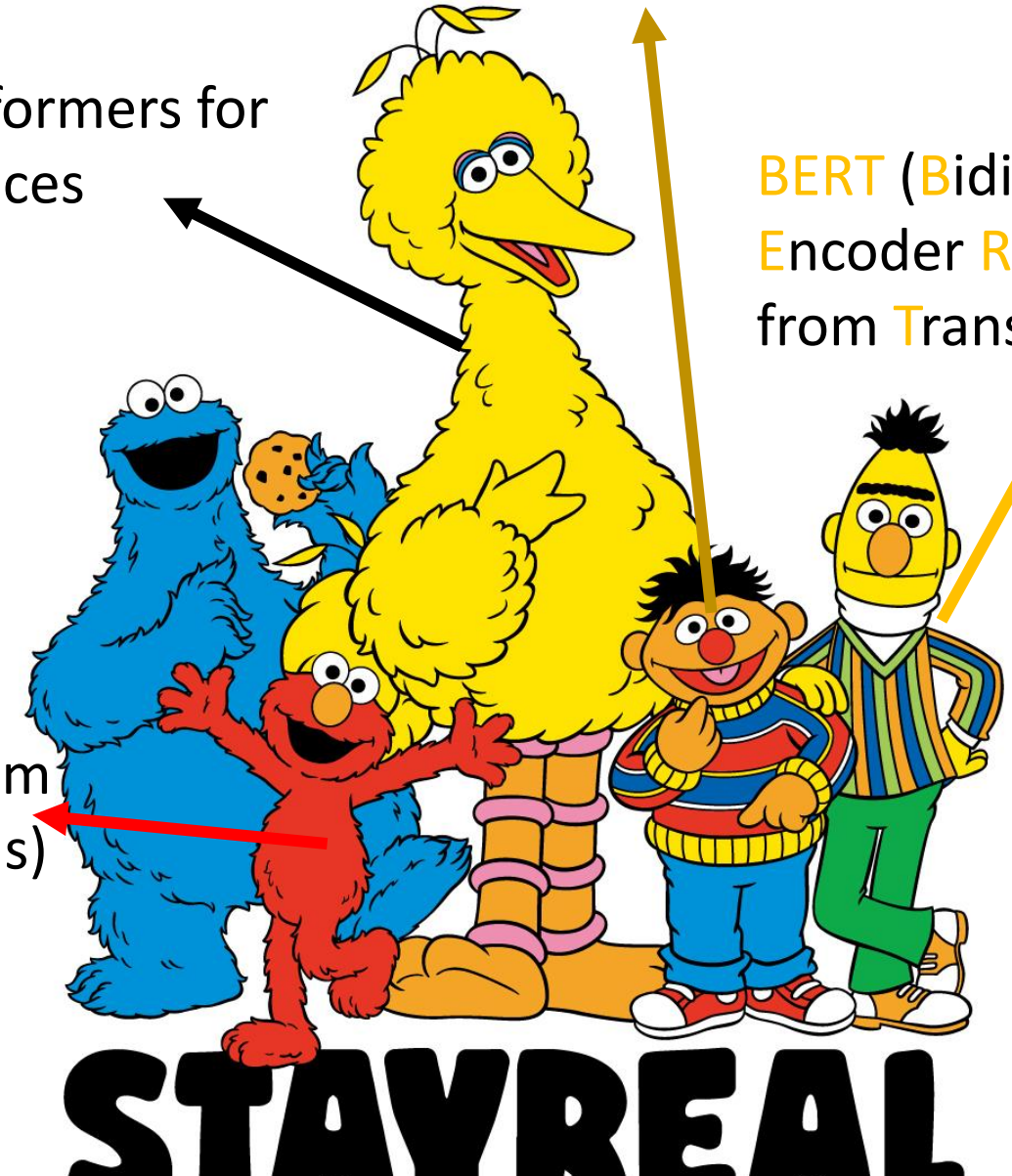
STAYREAL

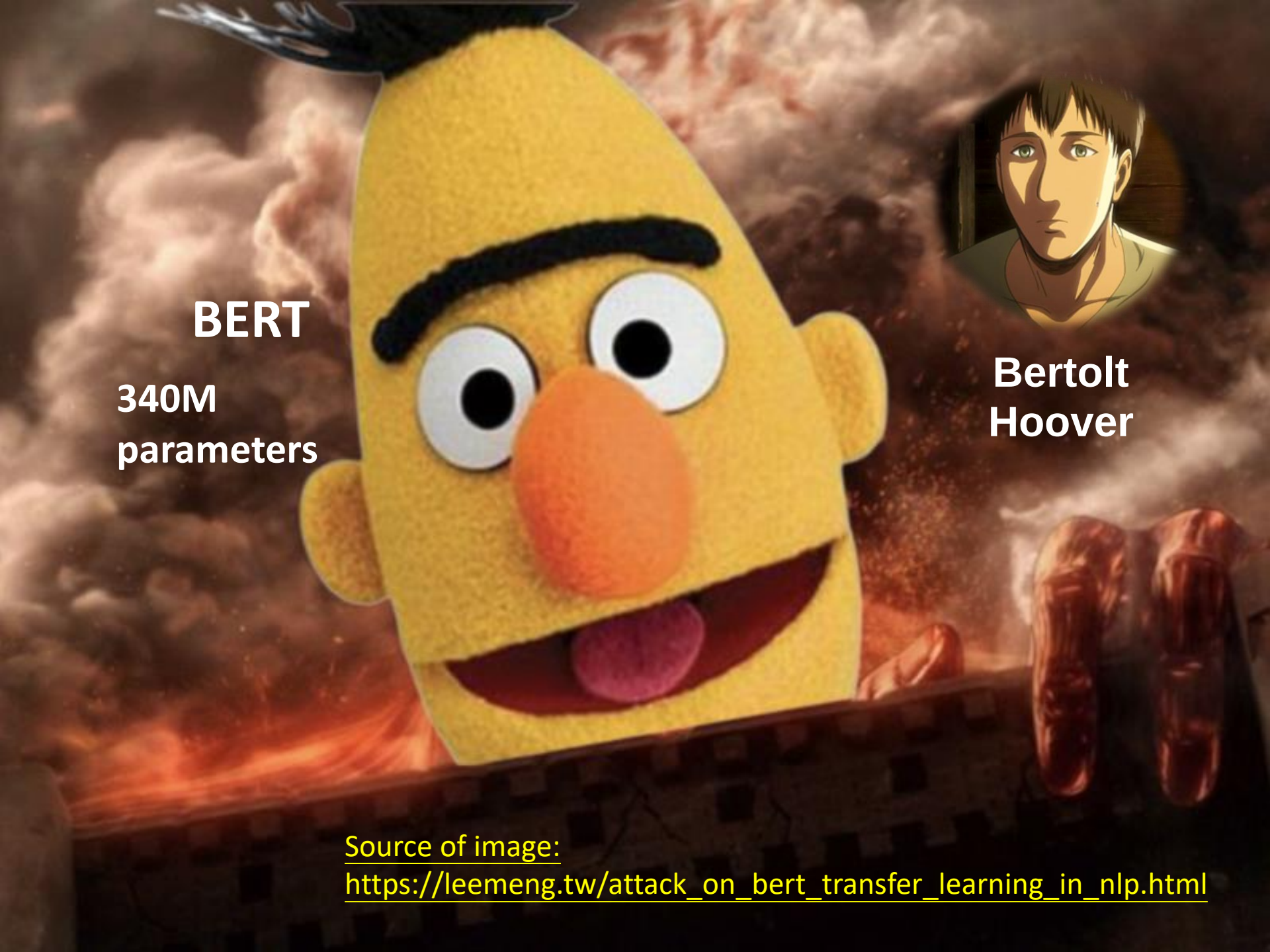
ERNIE (Enhanced Representation through Knowledge Integration)

Big Bird: Transformers for Longer Sequences

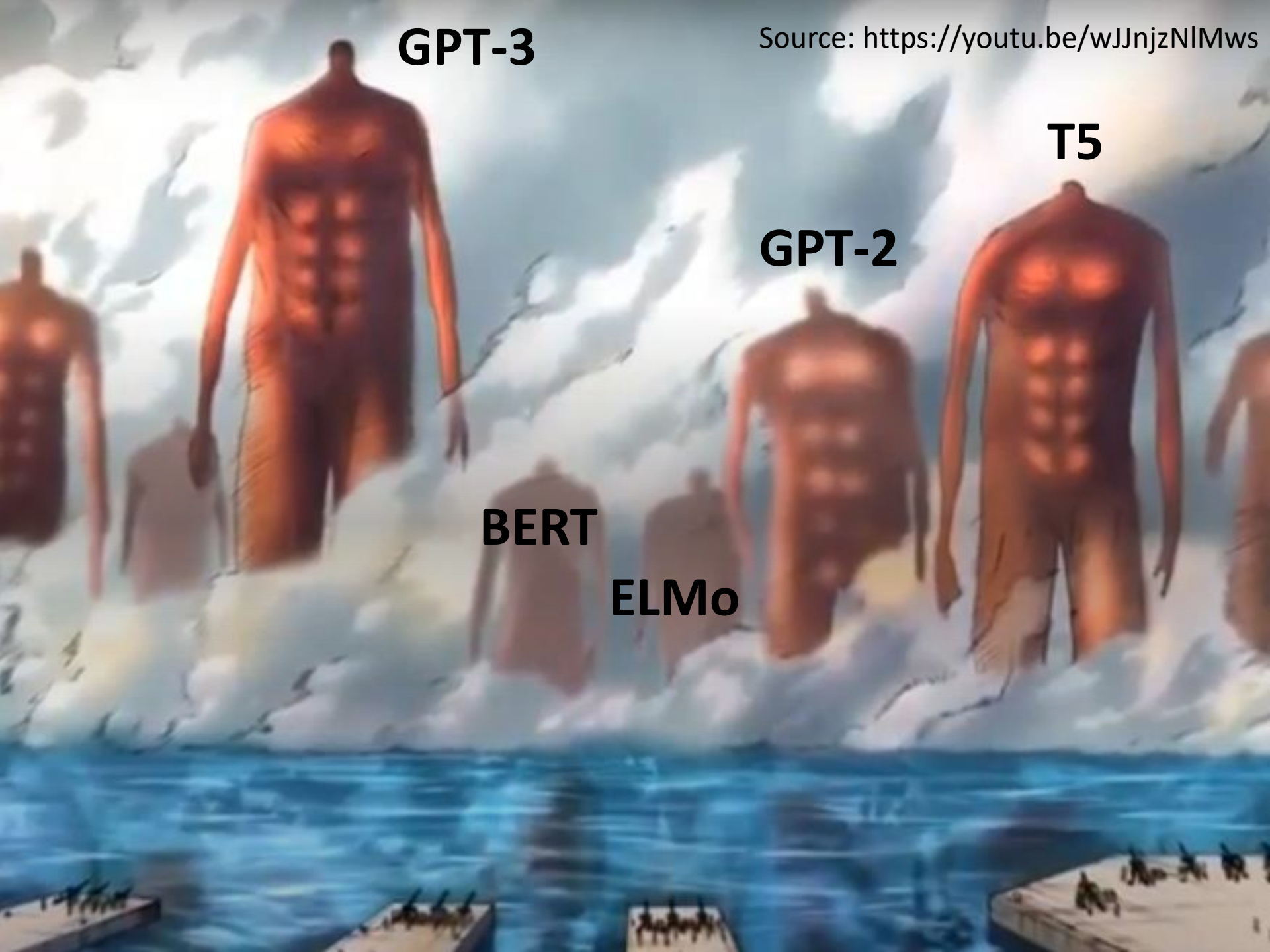
BERT (Bidirectional Encoder Representations from Transformers)

ELMo (Embeddings from Language Models)

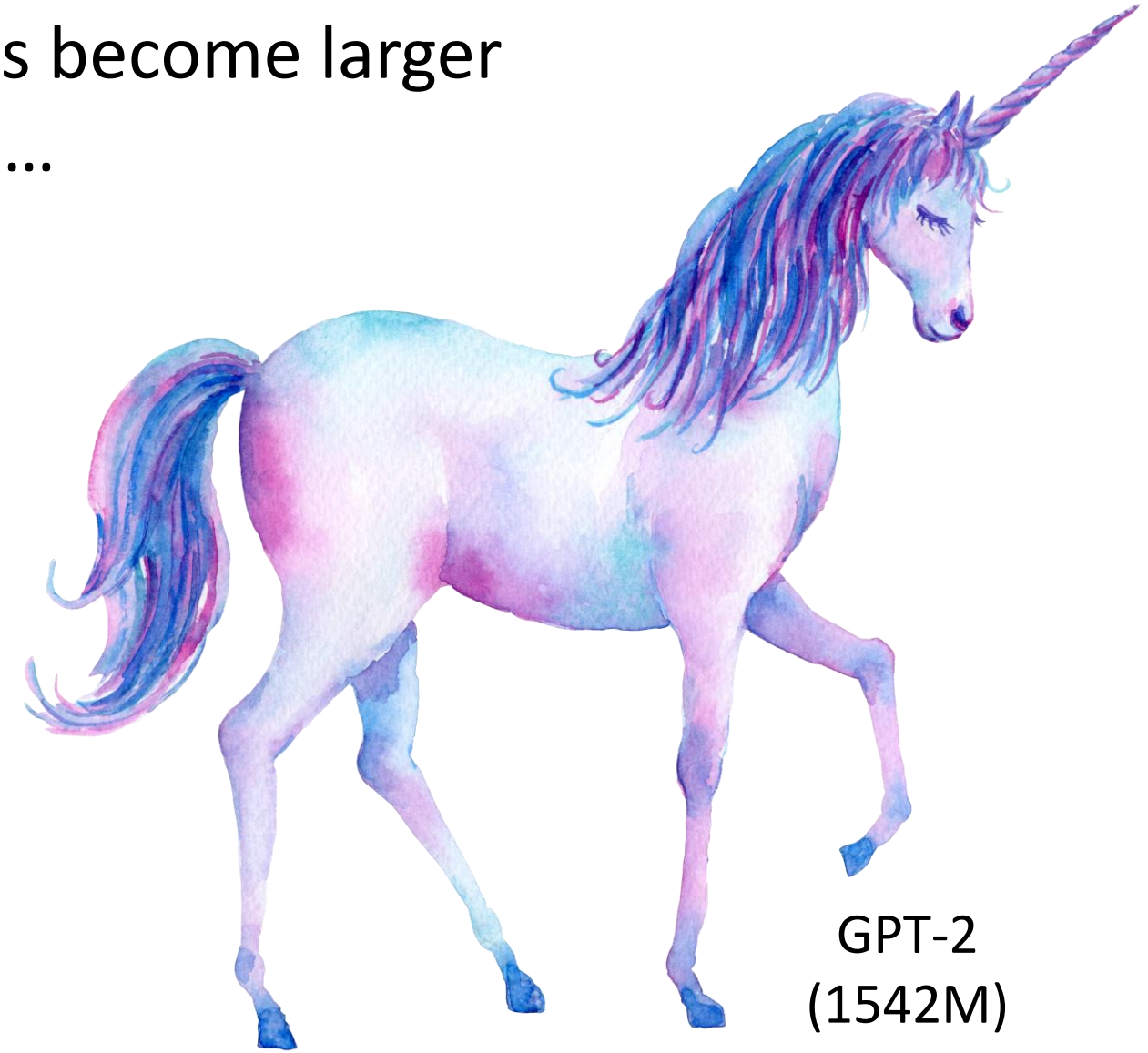




Source of image:
https://leemeng.tw/attack_on_bert_transfer_learning_in_nlp.html


GPT-3
Source: https://youtu.be/wJJnjzNlMws
T5
GPT-2
BERT
ELMo

The models become larger and larger …



ELMO (94M)

BERT (340M)

GPT-2 (1542M)

Source of image: https://huaban.com/pins/1714071707/

The models become larger and larger …

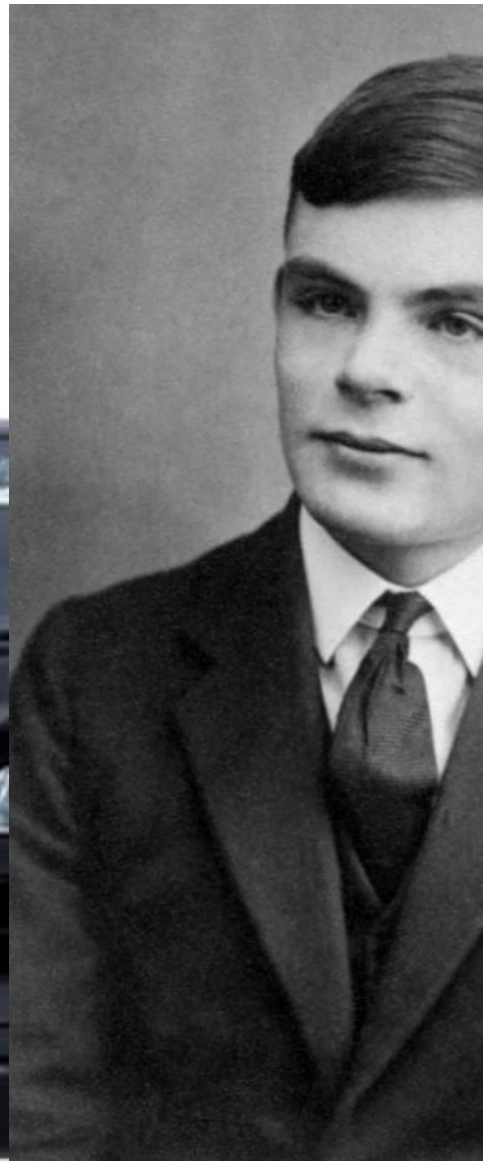
GPT-3 is **10** times larger than Turing NLG.

GPT-2

Megatron (8B)

T5 (11B)

Turing NLG (17B)



BERT (340M)

GPT-3 (175B)

Switch Transformer (1.6T)

https://arxiv.org/abs/2101.03961

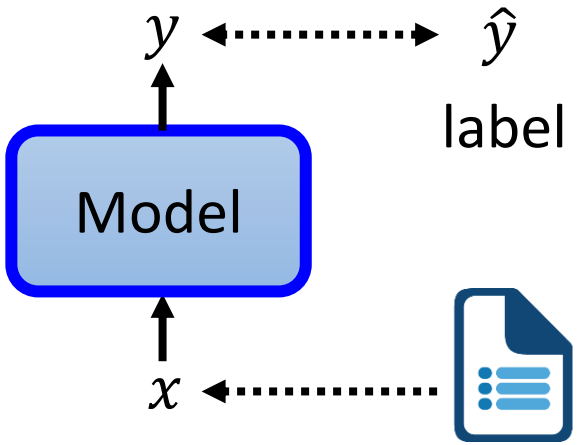
Outline

BERT series

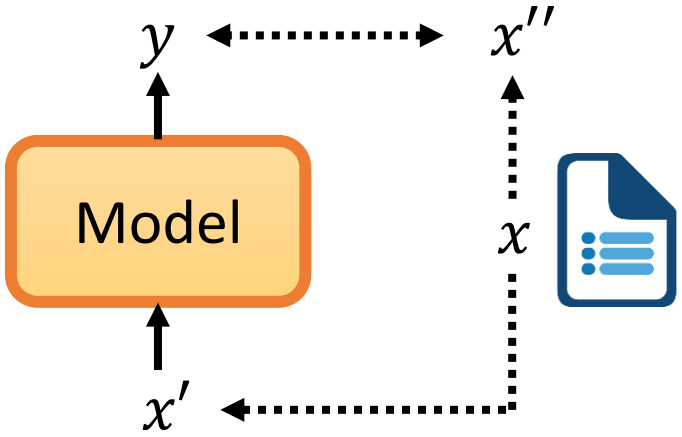
GPT series

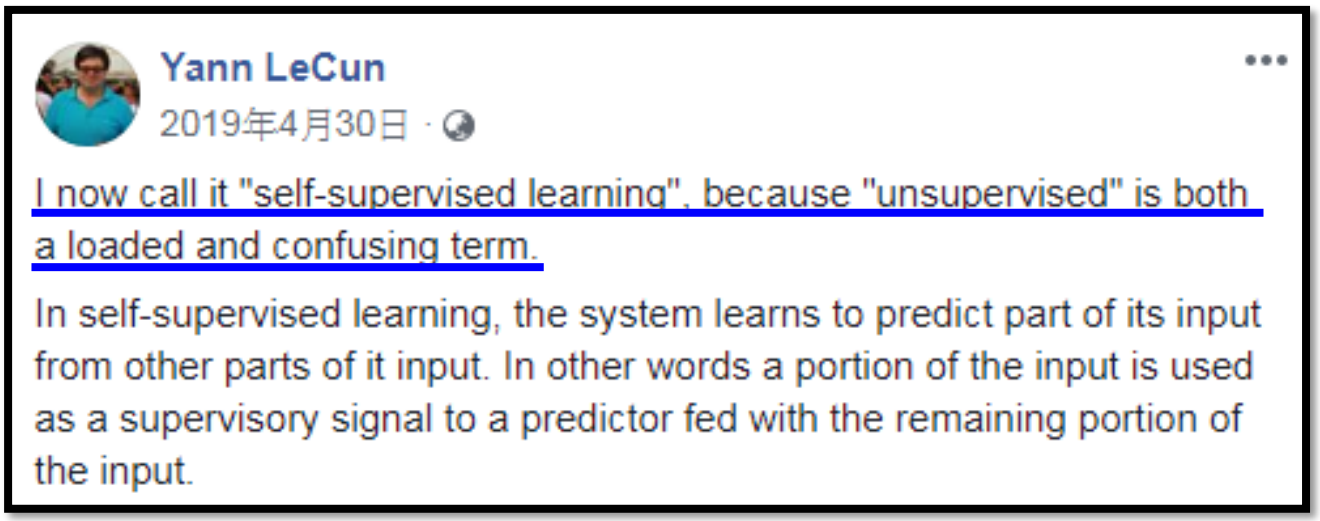
Self-supervised Learning

Supervised



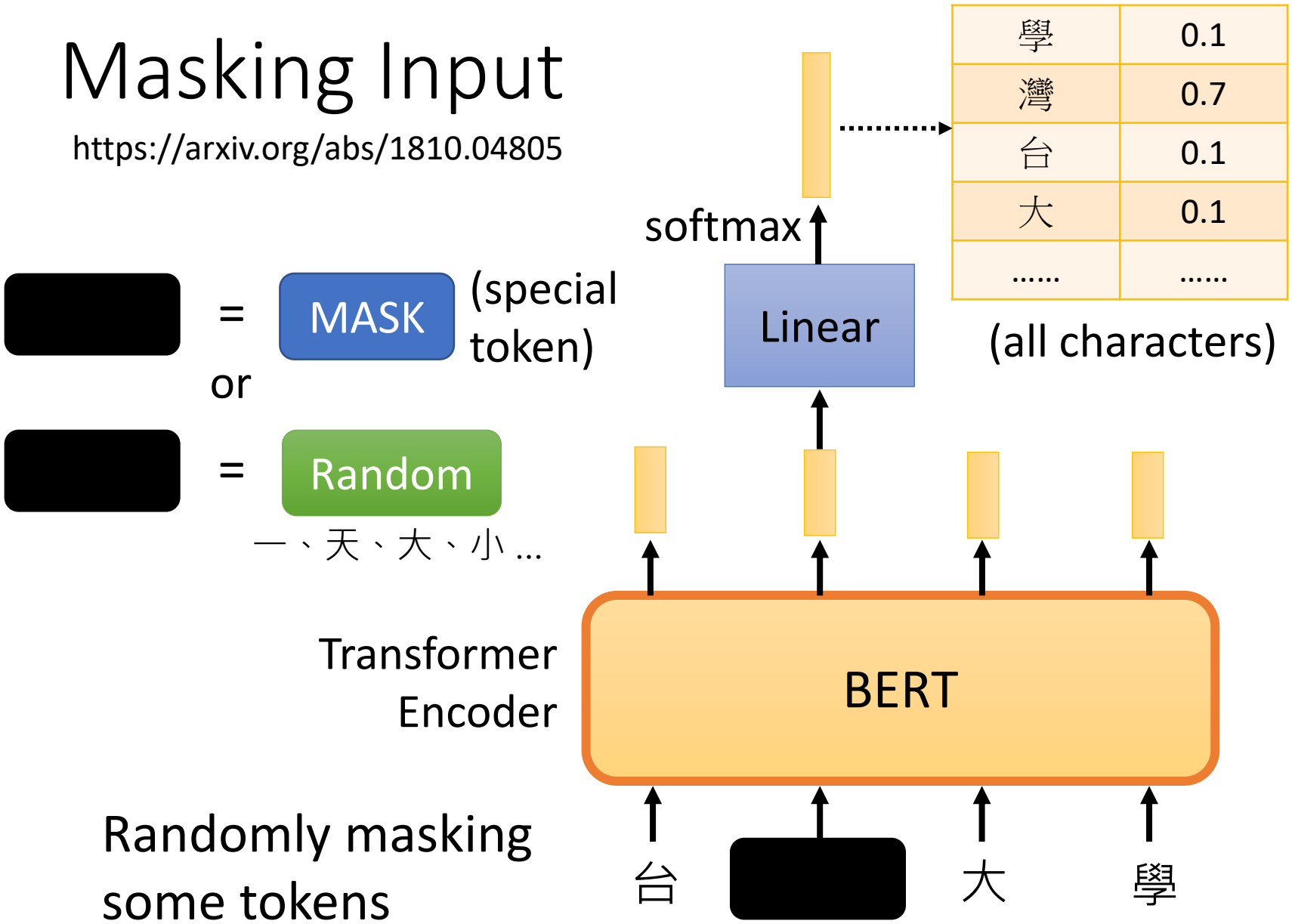
Self-supervised





Masking Input

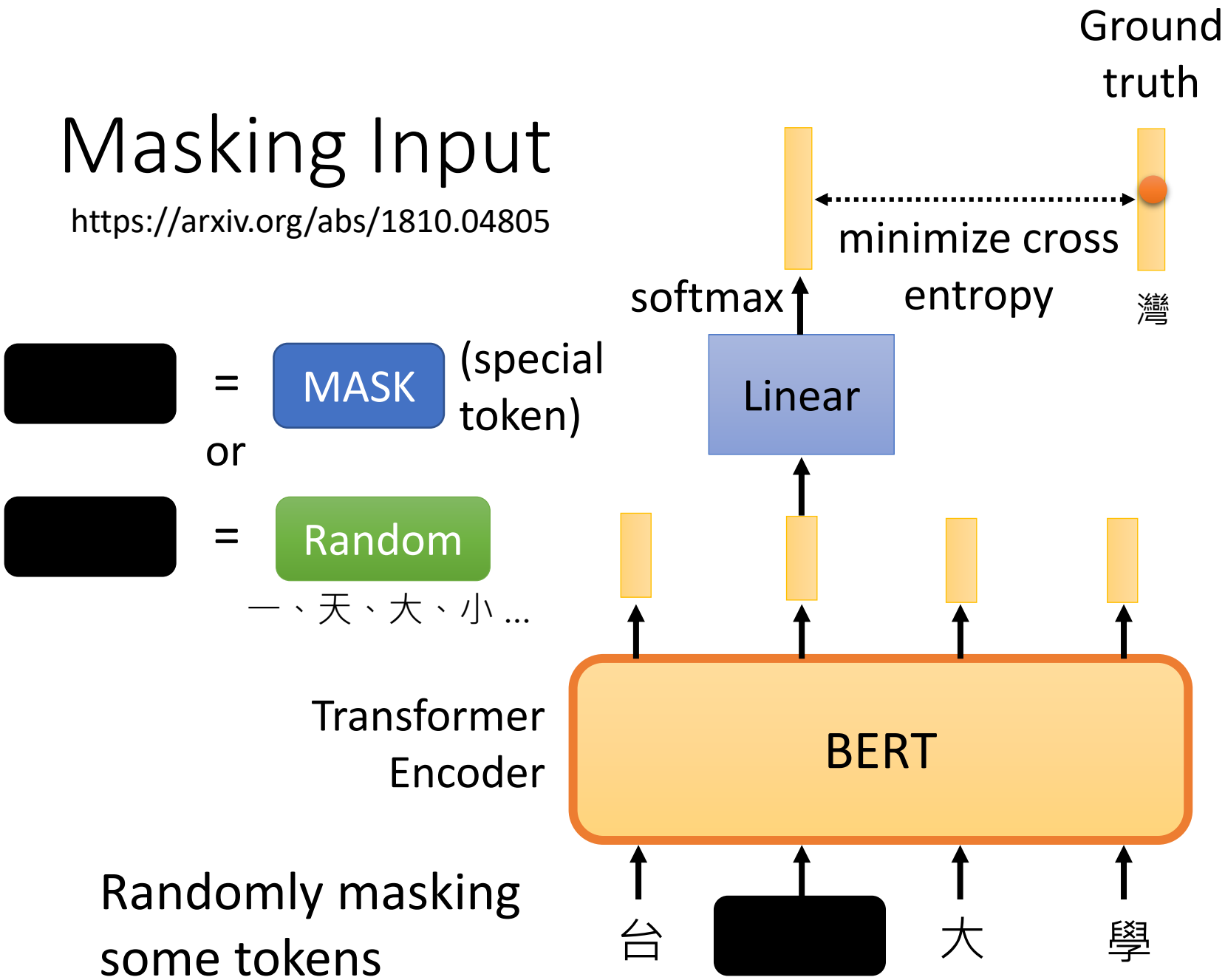
https://arxiv.org/abs/1810.04805



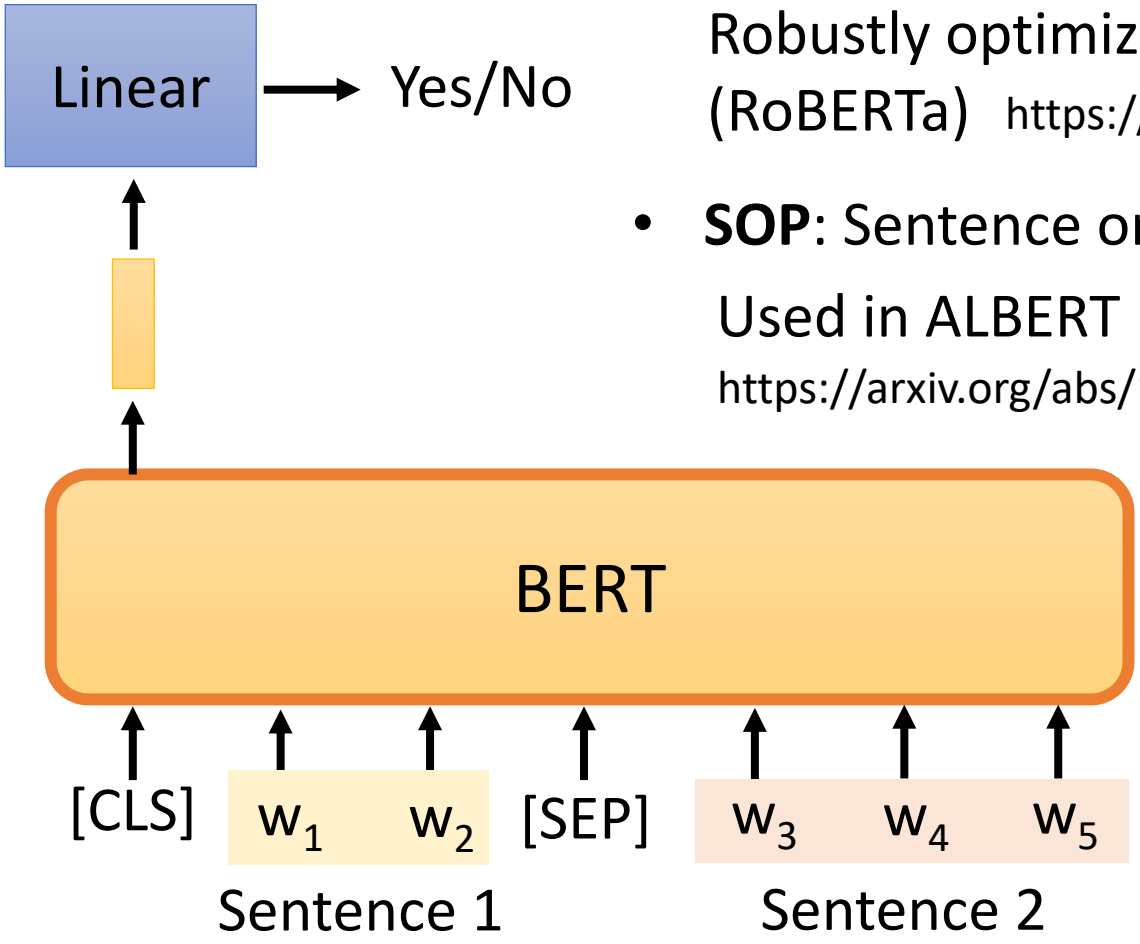
Randomly masking some tokens

Masking Input

https://arxiv.org/abs/1810.04805



Next Sentence Prediction



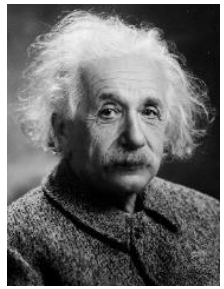
- This approach is not helpful.

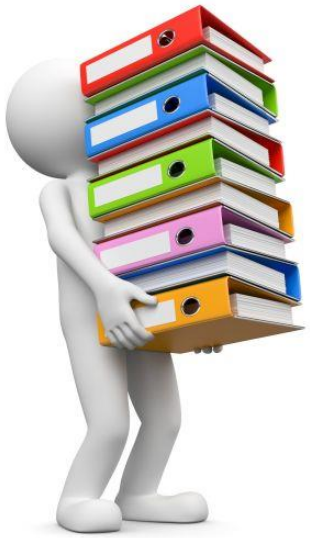
  Robustly optimized BERT approach (RoBERTa) https://arxiv.org/abs/1907.11692

- **SOP**: Sentence order prediction

  Used in ALBERT

  https://arxiv.org/abs/1909.11942





Self-supervised Learning

Pre-train

BERT

- Masked token prediction
- Next sentence prediction

Fine-tune

Model for Task 1

Model for Task 2

Model for Task 3

Downstream Tasks

- The tasks we care
- We have a little bit labeled data.

GLUE

General Language Understanding Evaluation (GLUE)

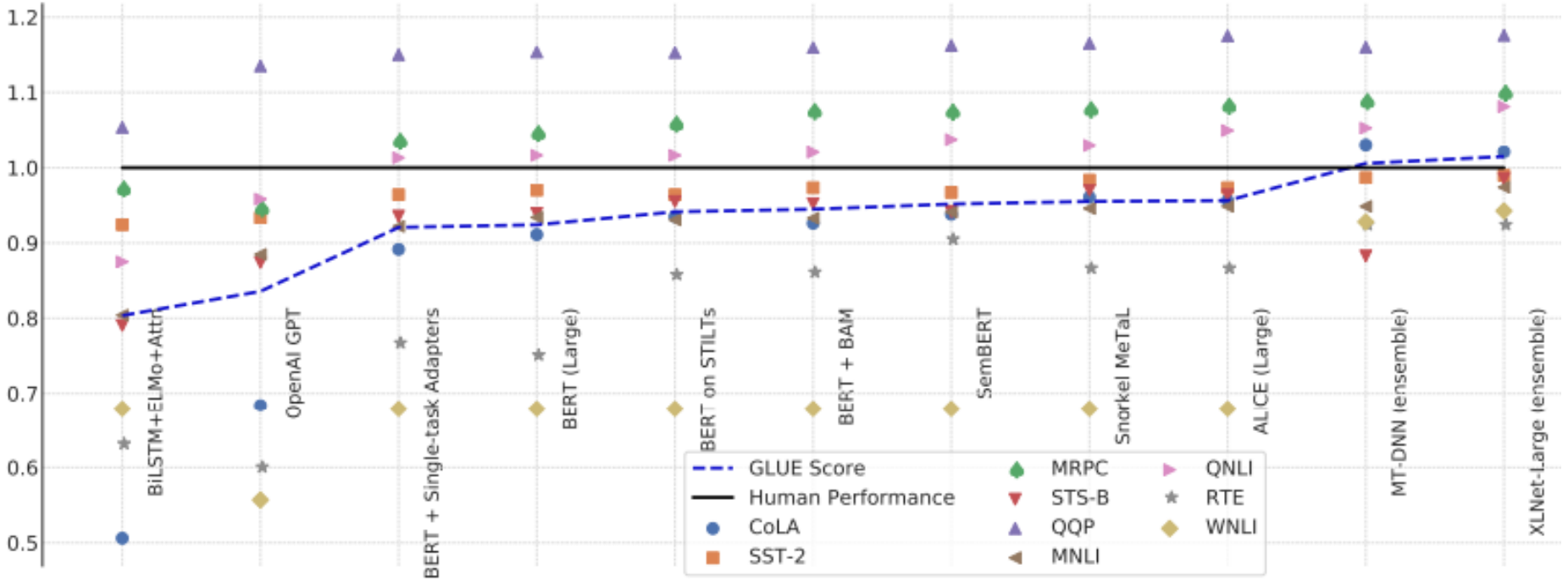
https://gluebenchmark.com/

- Corpus of Linguistic Acceptability (CoLA)
- Stanford Sentiment Treebank (SST-2)
- Microsoft Research Paraphrase Corpus (MRPC)
- Quora Question Pairs (QQP)
- Semantic Textual Similarity Benchmark (STS-B)
- Multi-Genre Natural Language Inference (MNLI)
- Question-answering NLI (QNLI)
- Recognizing Textual Entailment (RTE)
- Winograd NLI (WNLI)

GLUE also has Chinese version (https://www.cluebenchmarks.com/)

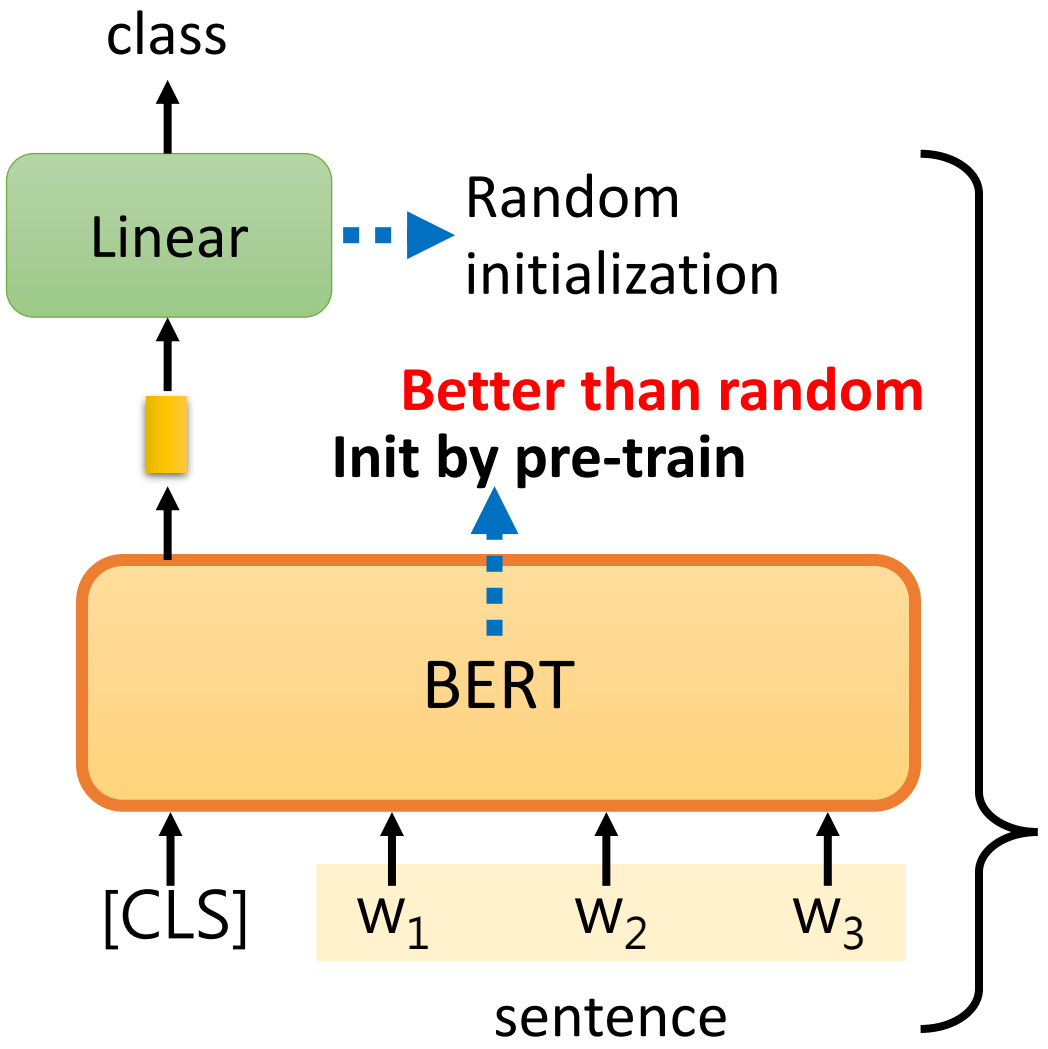
BERT and its Family

- GLUE scores



Source of image: https://arxiv.org/abs/1905.00537

How to use BERT – Case 1



Input: sequence
output: class

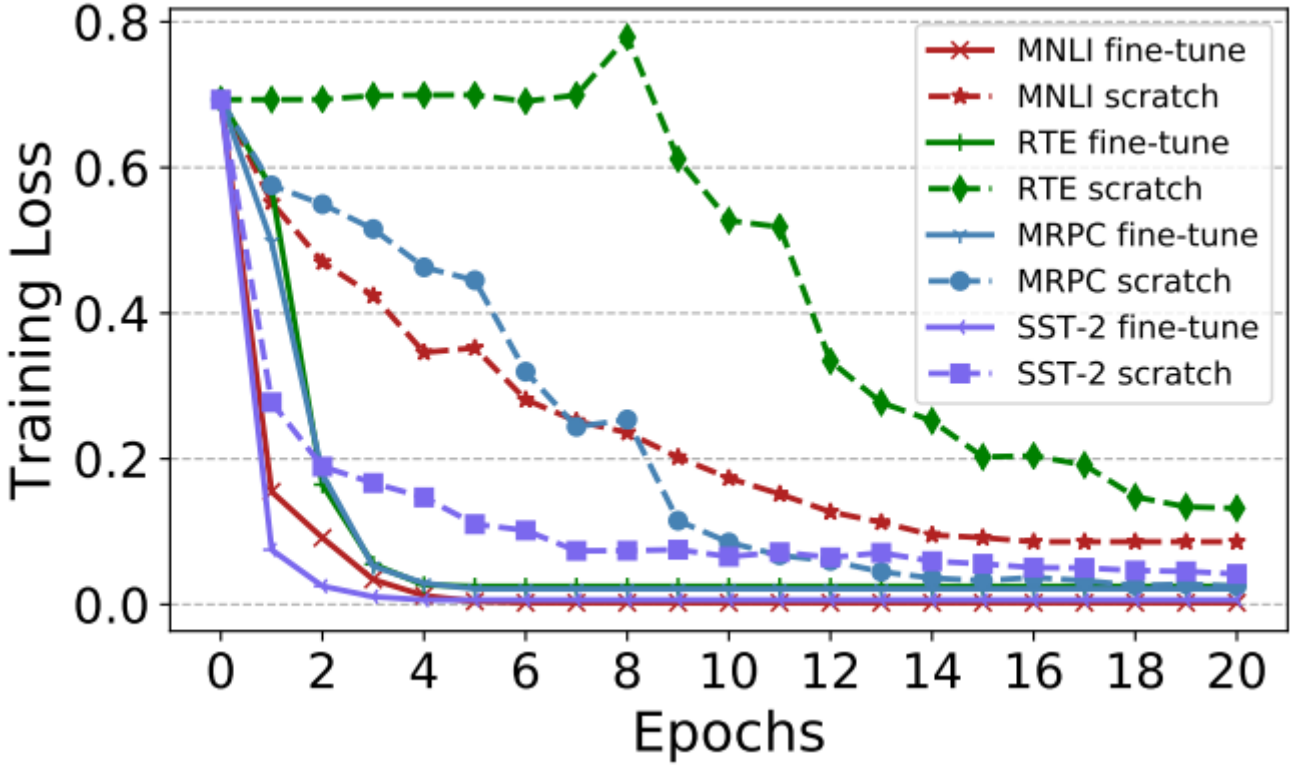
Example:
Sentiment analysis

this is good
↓
positive

This is the model to be learned.

Pre-train v.s. Random Initialization

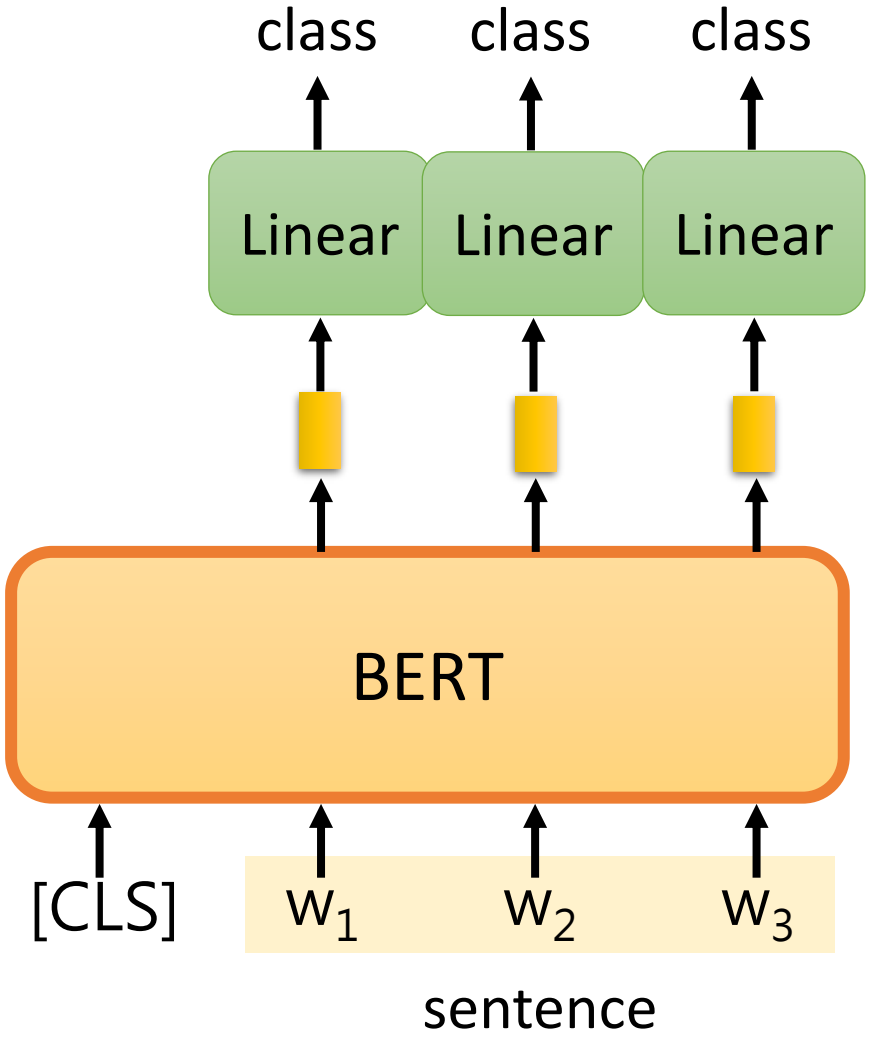
(fine-tune) (scratch)



Source of image: https://arxiv.org/abs/1908.05620

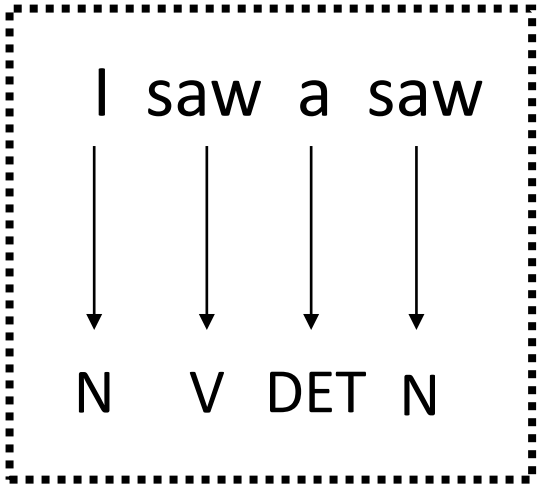

Q&A

How to use BERT – Case 2



Input: sequence
output: same as input

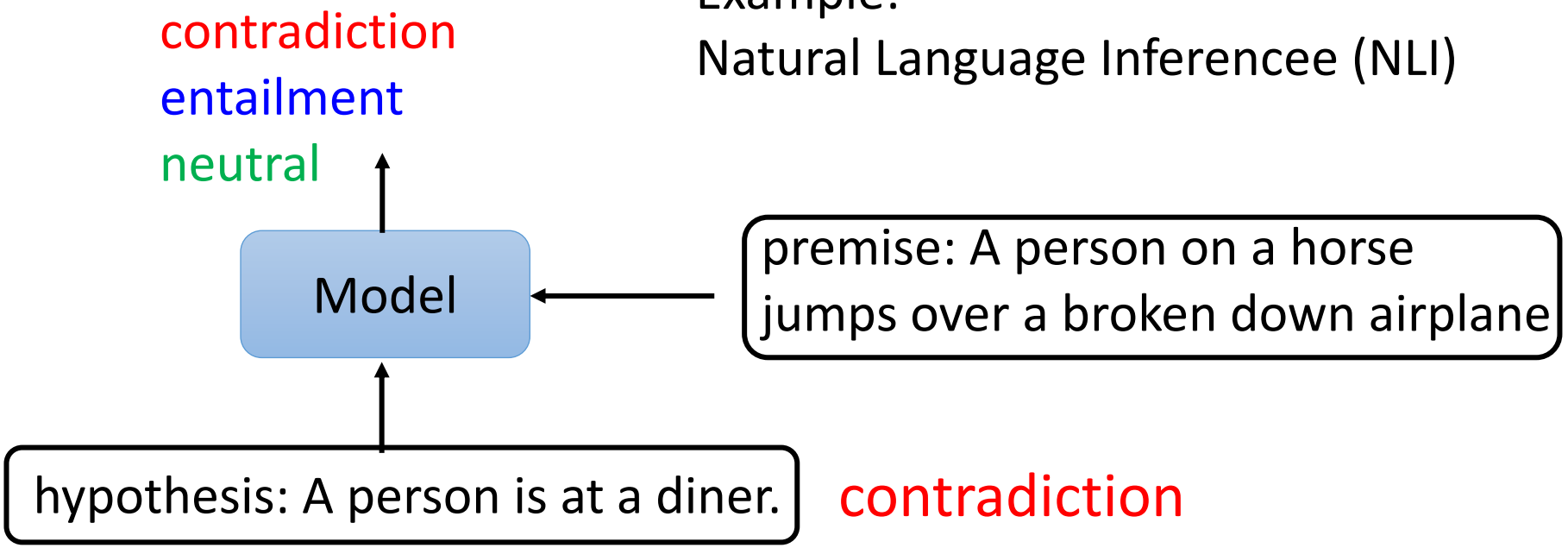
Example:
POS tagging



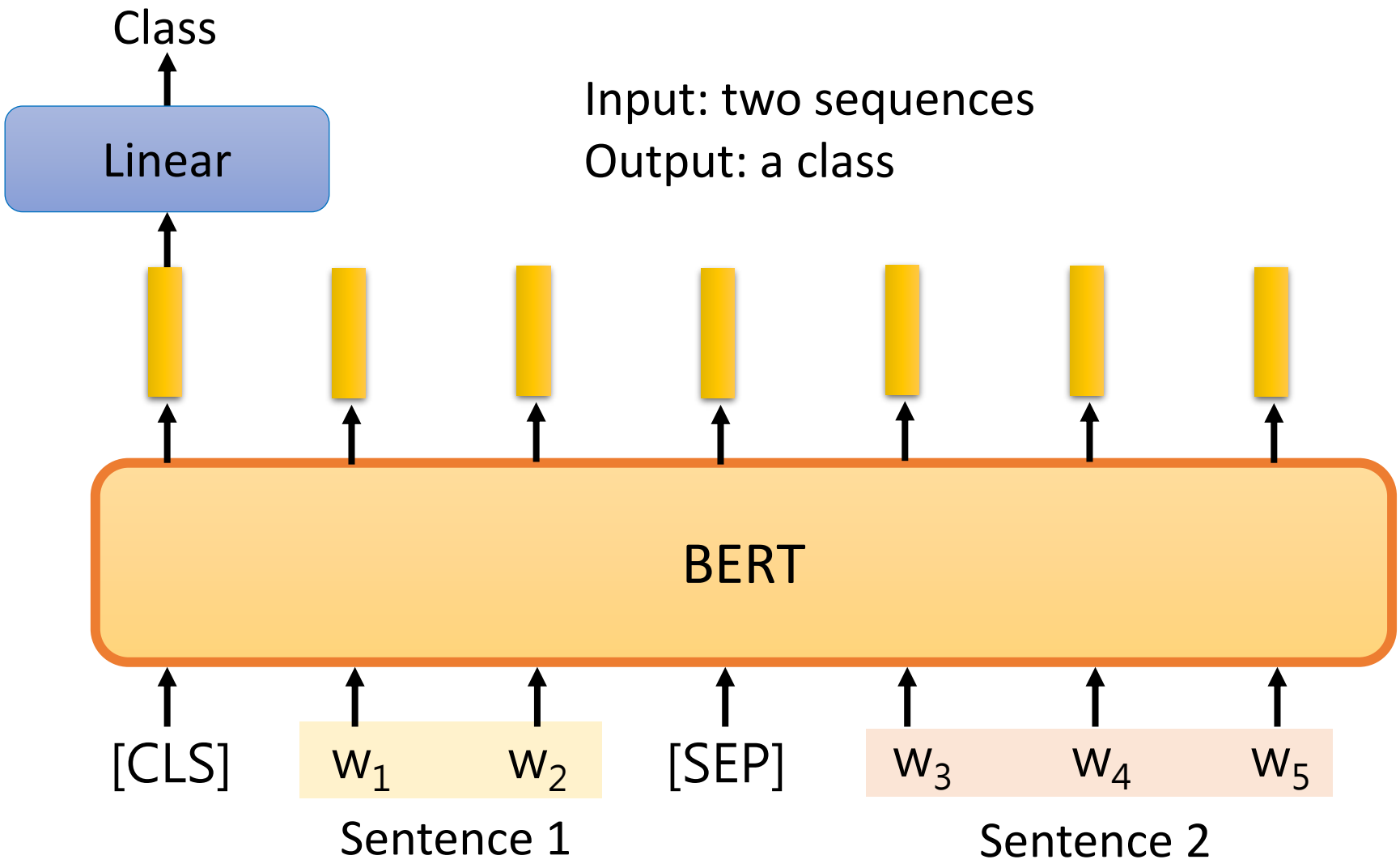
How to use BERT – Case 3

Input: two sequences
Output: a class

Example:
Natural Language Inferencee (NLI)



How to use BERT – Case 3

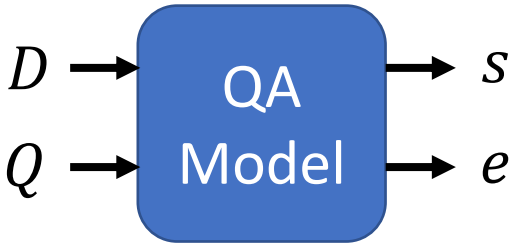


How to use BERT – Case 4

- Extraction-based Question Answering (QA)

Document: $D = \{d_1, d_2, \cdots, d_N\}$

Query: $Q = \{q_1, q_2, \cdots, q_M\}$



output: two integers (s, e)

Answer: $A = \{d_s, \cdots, d_e\}$

In meteorology, precipitation is any product of the condensation of 17 spheric water vapor that falls under gravity. The main forms of precipitation include drizzle, rain, sleet, snow, graupel and hail... Precipitation forms as smaller droplets coalesce via collision with other rain drops or ice crystals within a cloud. Short, intense periods of rain 77 atte 79 cations are called "showers".

What causes precipitation to fall?
gravity

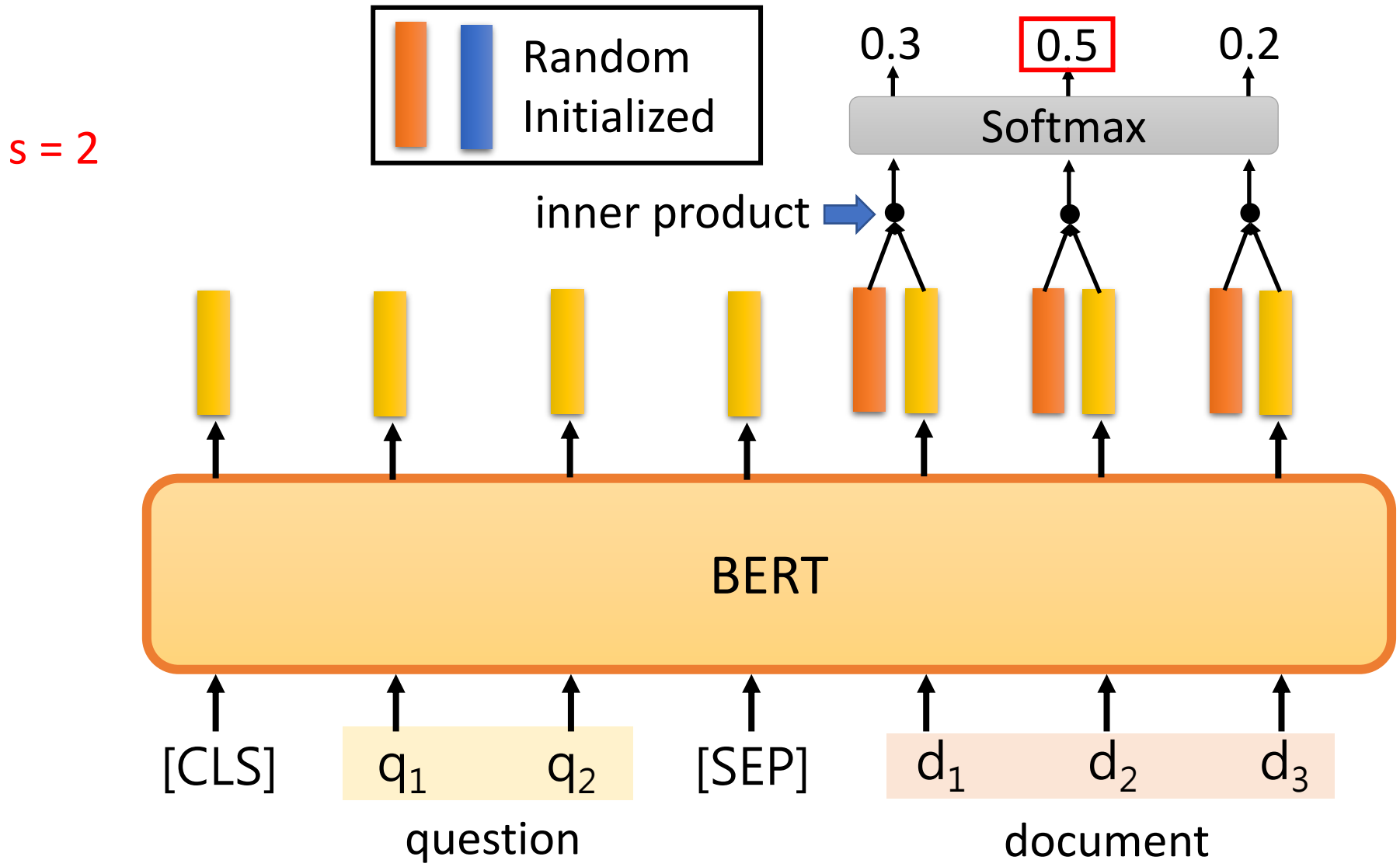
$s = 17, e = 17$

What is another main form of precipitation besides drizzle, rain, snow, sleet and hail?
graupel

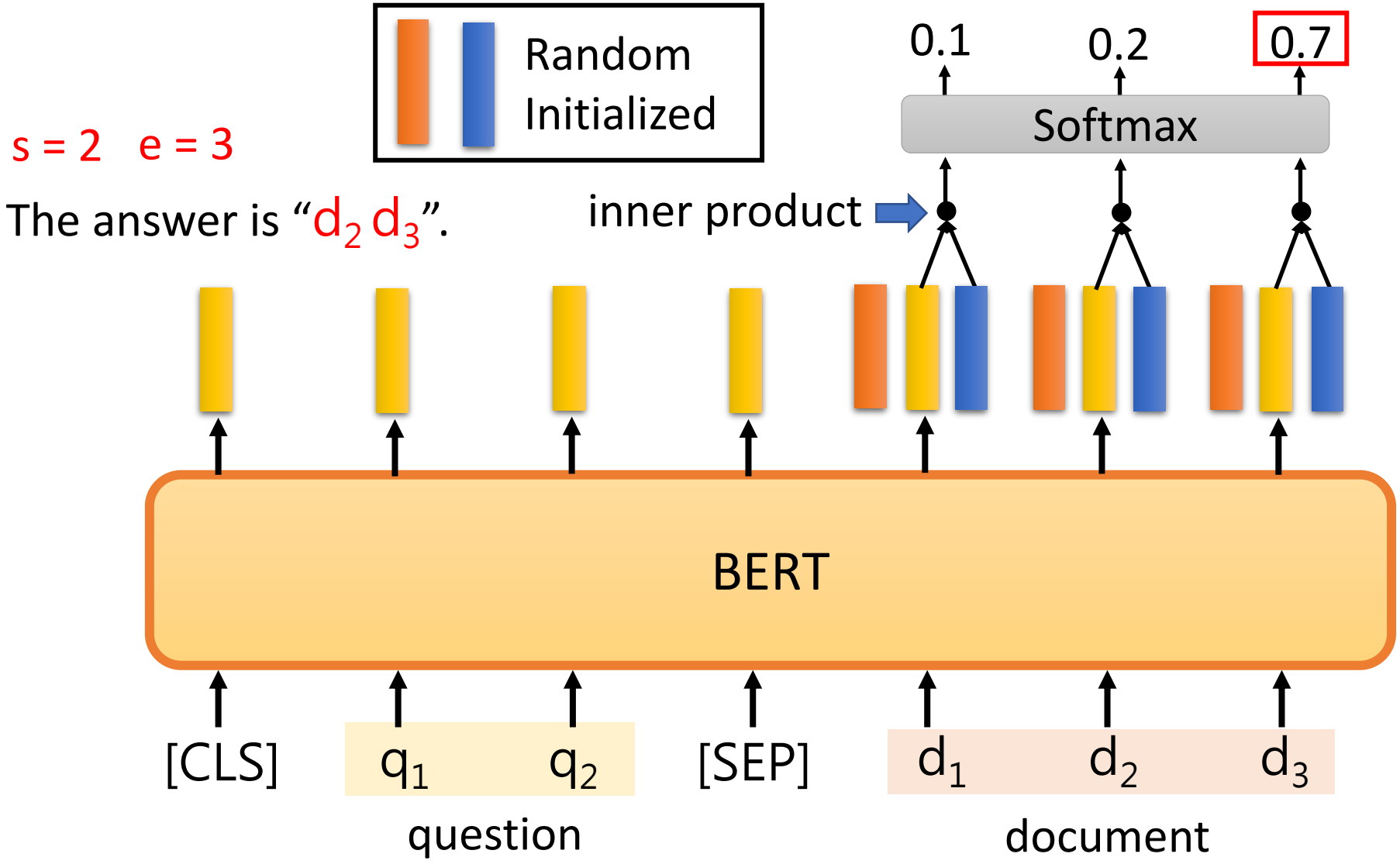
Where do water droplets collide with ice crystals to form precipitation?
within a cloud

$s = 77, e = 79$

How to use BERT – Case 4



How to use BERT – Case 4



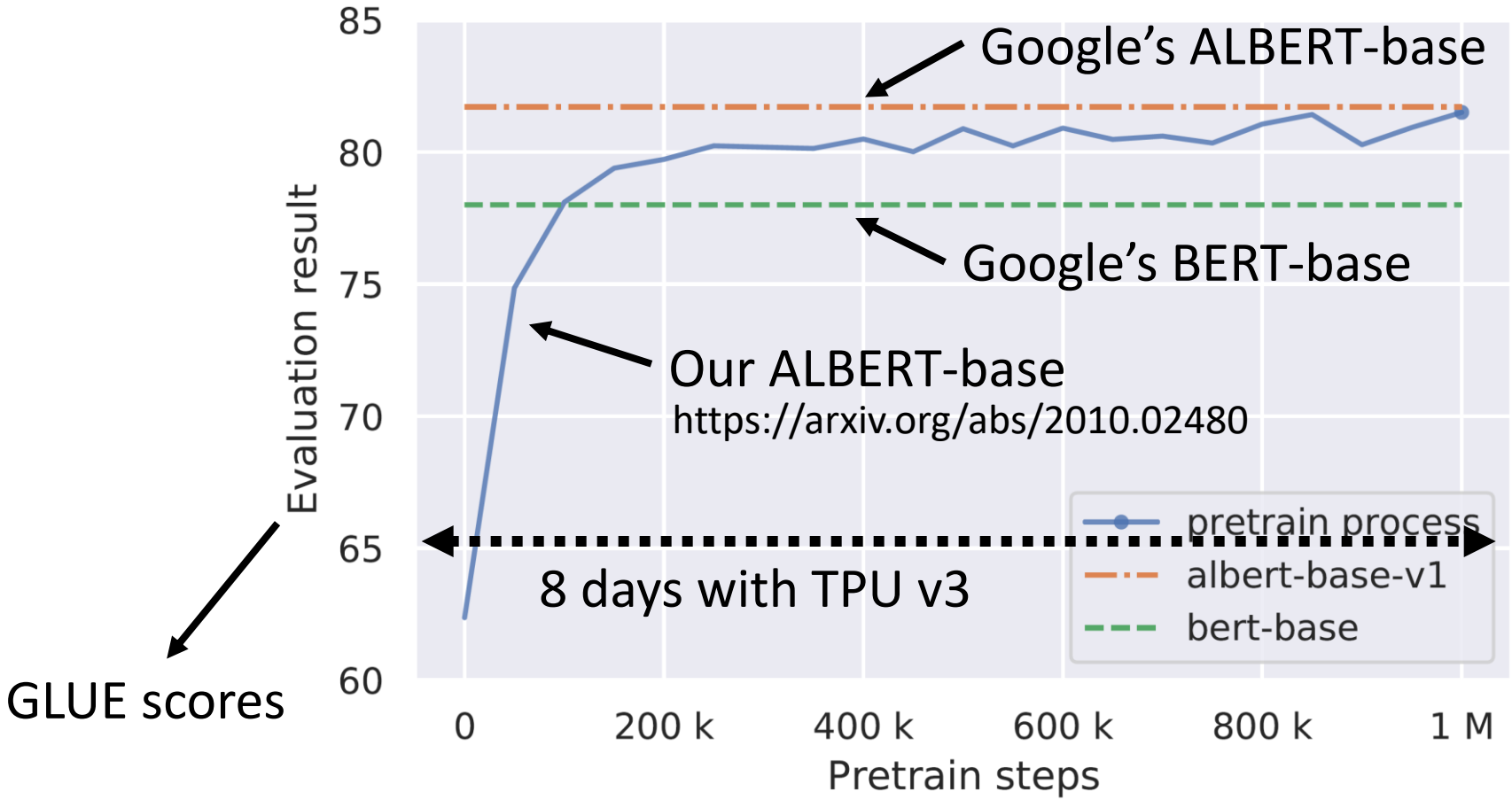
That's all!

台達電產學合作計畫研究成果
This work is done by 姜成翰

Training BERT is challenging!

Training data has more than **3 billions** of words.

3000 times of **Harry Potter series**



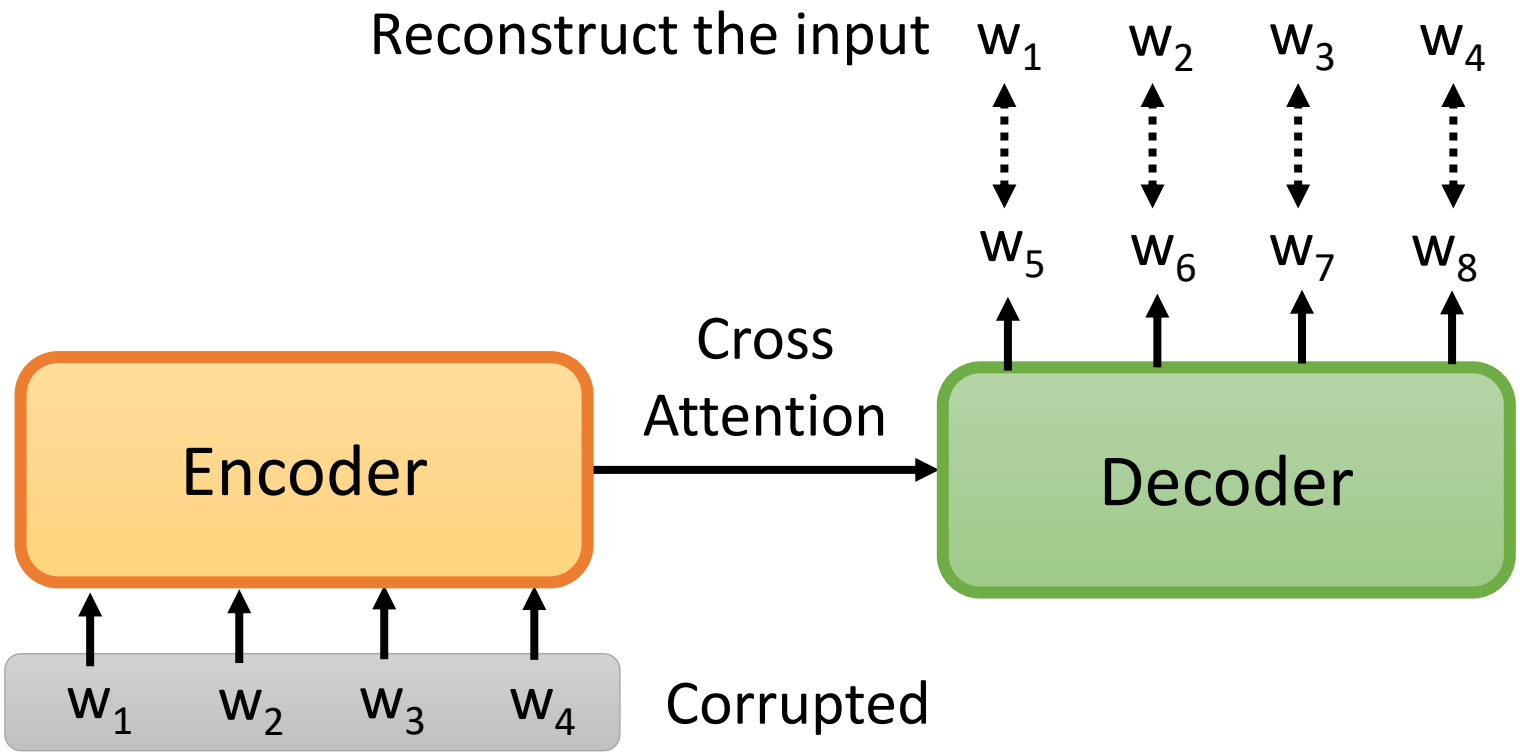
BERT Embryology (胚胎學)

https://arxiv.org/abs/2010.02480

When does BERT know POS tagging, syntactic parsing, semantics?

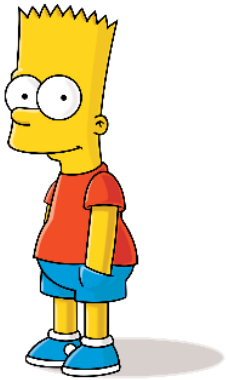
The answer is counterintuitive!

Pre-training a seq2seq model



MASS / BART

MASS



BART

A B [SEP] C D E

A B [SEP] C ▢ E

A B [SEP] C E

(Delete “D”)

C D E [SEP] A B

(permutation)

D E A B [SEP] C

(rotation)

A ▢ B [SEP] ▢ E

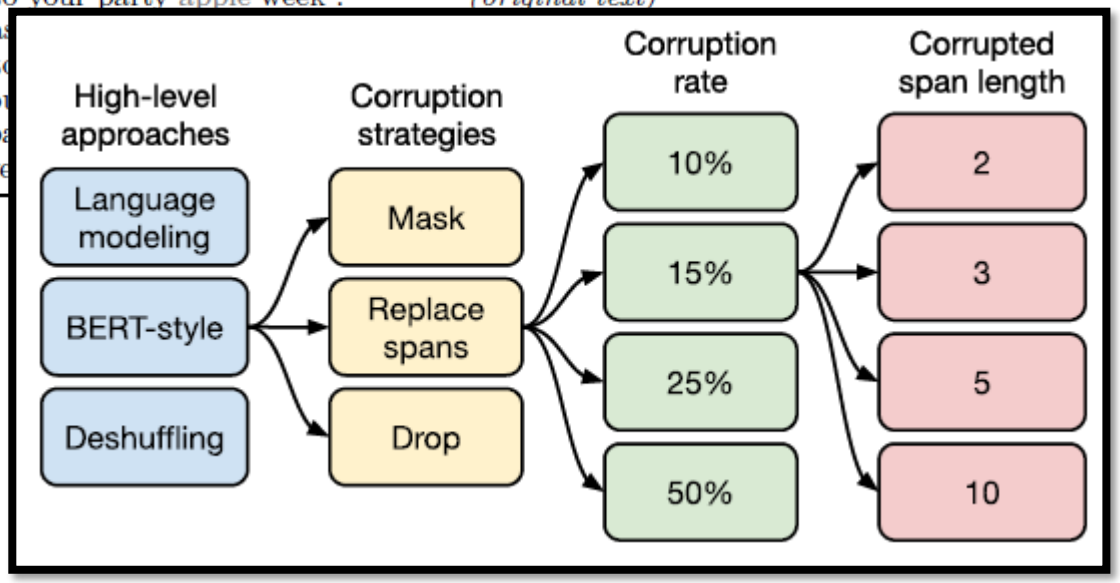
Text Infilling

https://arxiv.org/abs/1905.02450
https://arxiv.org/abs/1910.13461

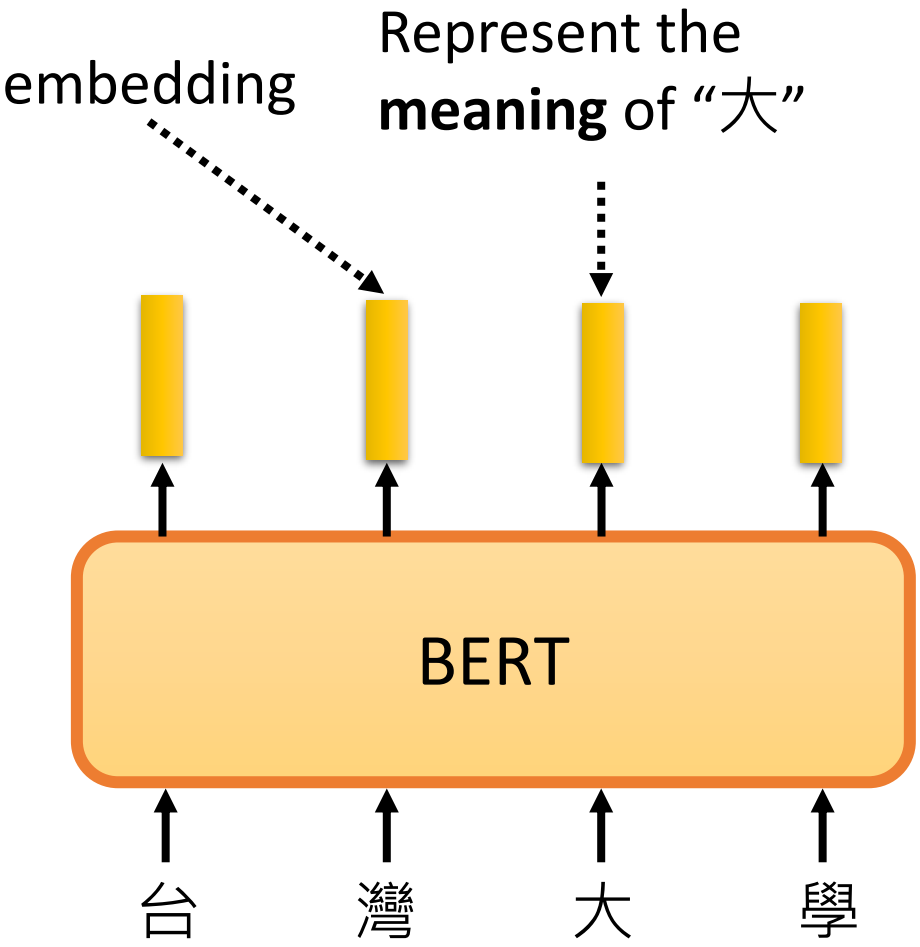
T5 – Comparison

- Transfer Text-to-Text Transformer (T5)
- Colossal Clean Crawled Corpus (C4)

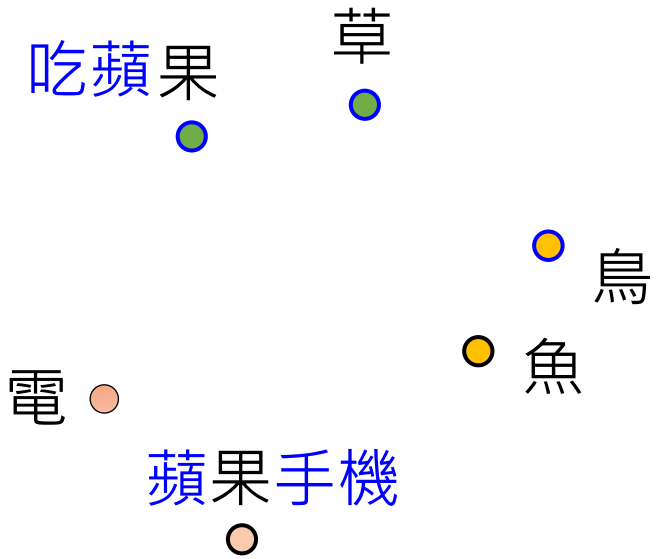
Objective	Inputs	Targets
Prefix language modeling	Thank you for inviting	me to your party last week .
BERT-style	Thank you <M> <M> me to your party apple week .	*(original text)*
Deshuffling	party me for your to . las	
I.i.d. noise, mask tokens	Thank you <M> <M> me t	
I.i.d. noise, replace spans	Thank you <X> me to yo	
I.i.d. noise, drop tokens	Thank you me to your pa	
Random spans	Thank you <X> to <Y> we	



Why does BERT work?

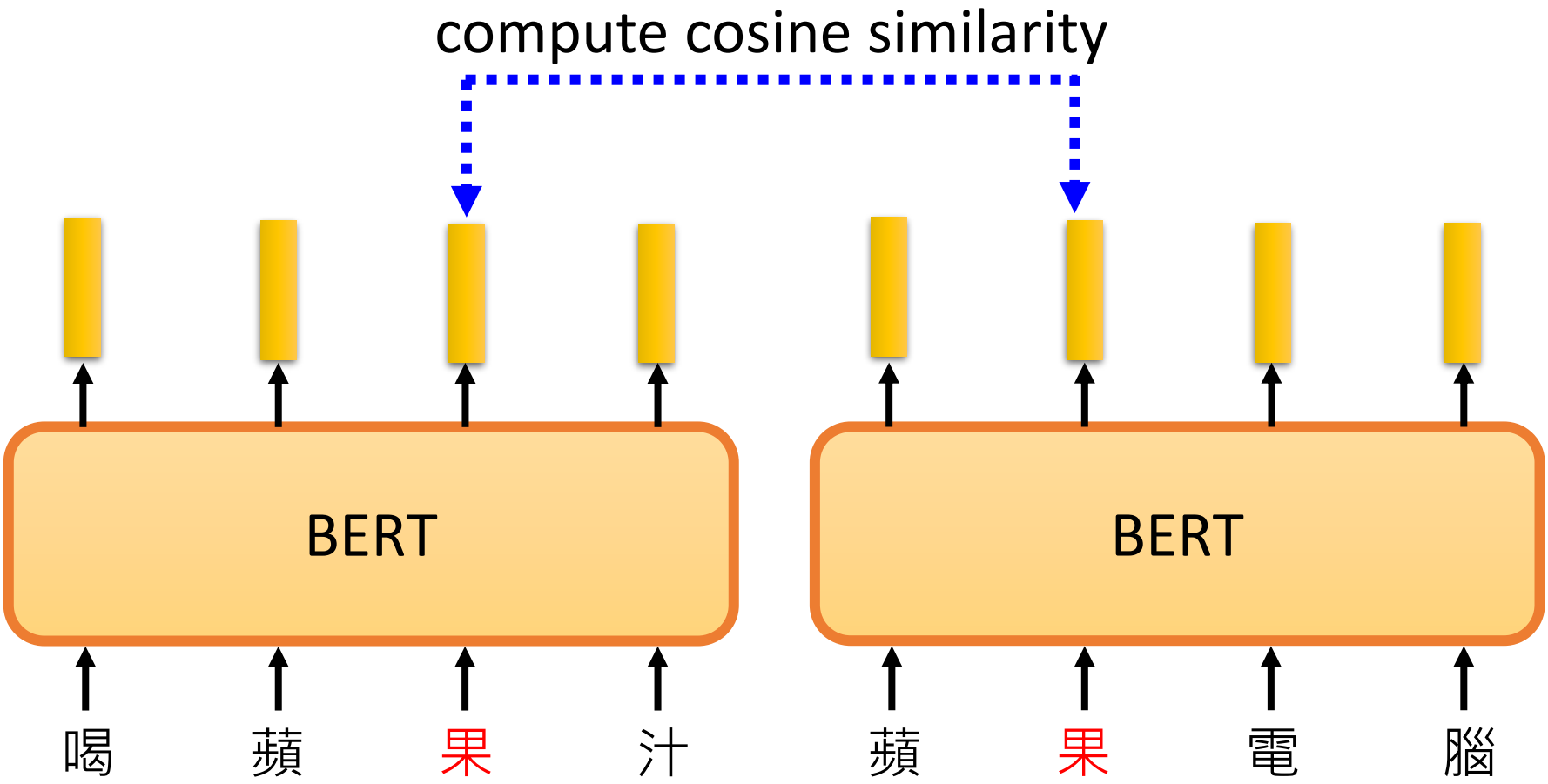


The tokens with similar meaning have similar embedding.



Context is considered.

Why does BERT work?



Cosine Similarities of BERT Embeddings

今天買了蘋果來吃

進口蘋果(富士)平均每公斤下跌12.3%

蘋果茶真難喝

老饕都知道智利的蘋果季節即將到來

進口蘋果因防止水分流失故添加人工果蠟

蘋果即將於下月發表新款 iPhone

蘋果獲新 Face ID 專利

今天買了蘋果手機

蘋果的股價又跌了

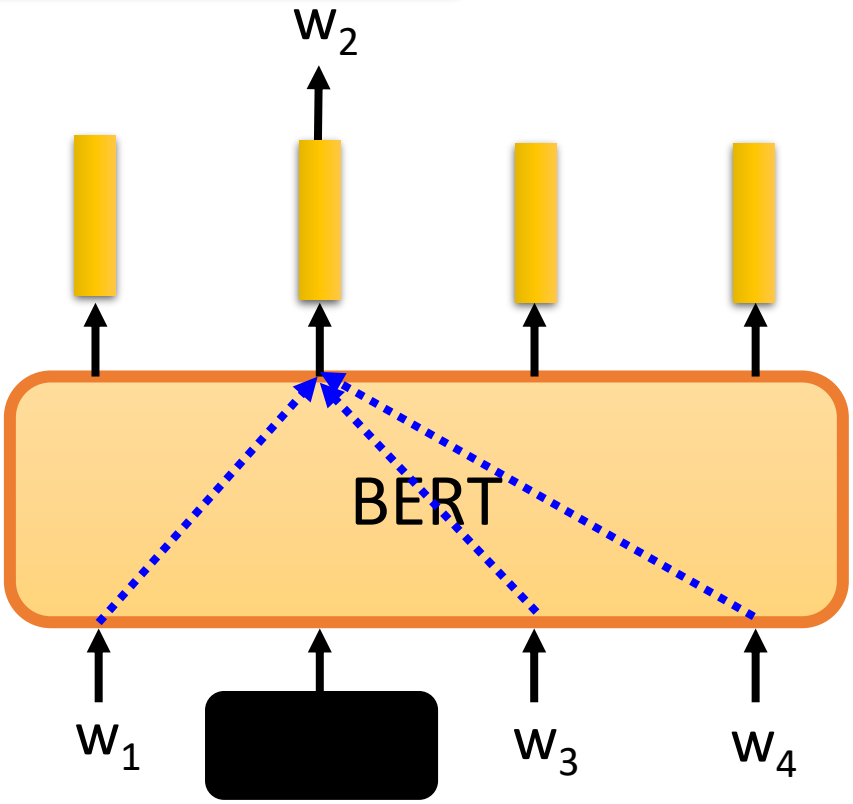
蘋果押寶指紋辨識技術

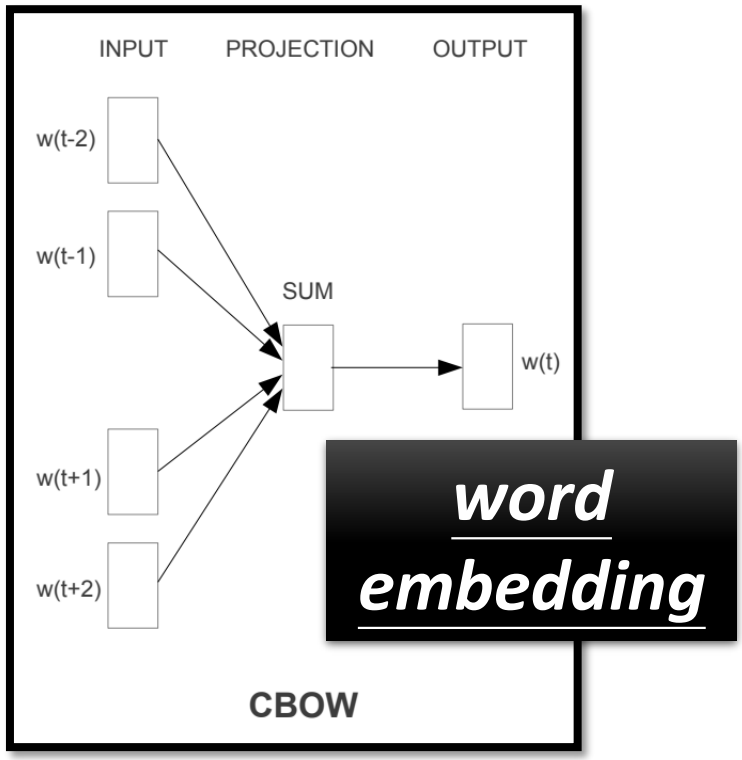
Why does BERT work?

Contextualized word embedding

You shall know a word by the company it keeps

John Rupert Firth





word embedding

https://arxiv.org/abs/2103.07162

This work is done by 高瑋聰

Why does BERT work?

- Applying BERT to **protein**, **DNA**, **music classification**

class	DNA sequence
EI	CCAGCTGCATCACAGGAGGCCAGCG
EI	AGACCCGCCGGGAGGCGGAGGACC
IE	AACGTGGCCTCCTTGTGCCCTTCCCC
IE	CCACTCAGCCAGGCCCTTCTTCTCCT
IE	CCTGATCTGGGTCTCCCCTCCCACCC
IE	AGCCCTCAACCCTTCTGTCTCACCCT
IE	CCACTCAGCCAGGCCCTTCTTCTCCT
N	CTGTGTTCACCACATCAAGCGCCGGC
N	GTGTTACCGAGGGCATTTCTAACAGT
N	TCTGAGCTCTGCATTTGTCTATTCTCC

Why does BERT work?

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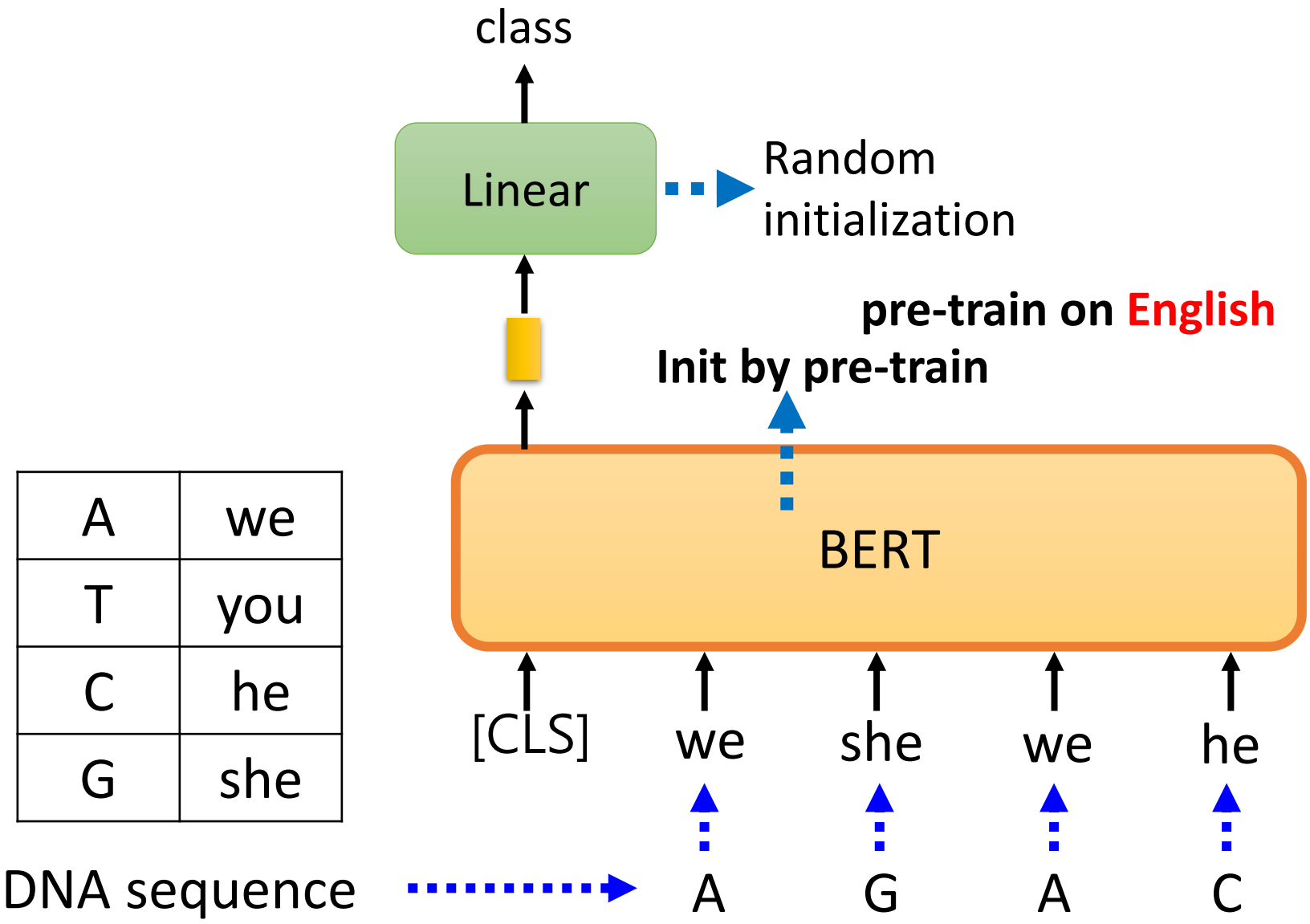


A	we
T	you
C	he
G	she

https://arxiv.org/abs/2103.07162

This work is done by 高瑋聰

Why does BERT work?

- Applying BERT to **protein**, **DNA**, **music classification**

	Protein			DNA				Music
	localization	stability	fluorescence	H3	H4	H3K9ac	Splice	composer
specific	69.0	76.0	63.0	87.3	87.3	79.1	94.1	-
BERT	64.8	74.5	63.7	83.0	86.2	78.3	97.5	55.2
re-emb	63.3	75.4	37.3	78.5	83.7	76.3	95.6	55.2
rand	58.6	65.8	27.5	75.6	66.5	72.8	95	36

To Learn More ……

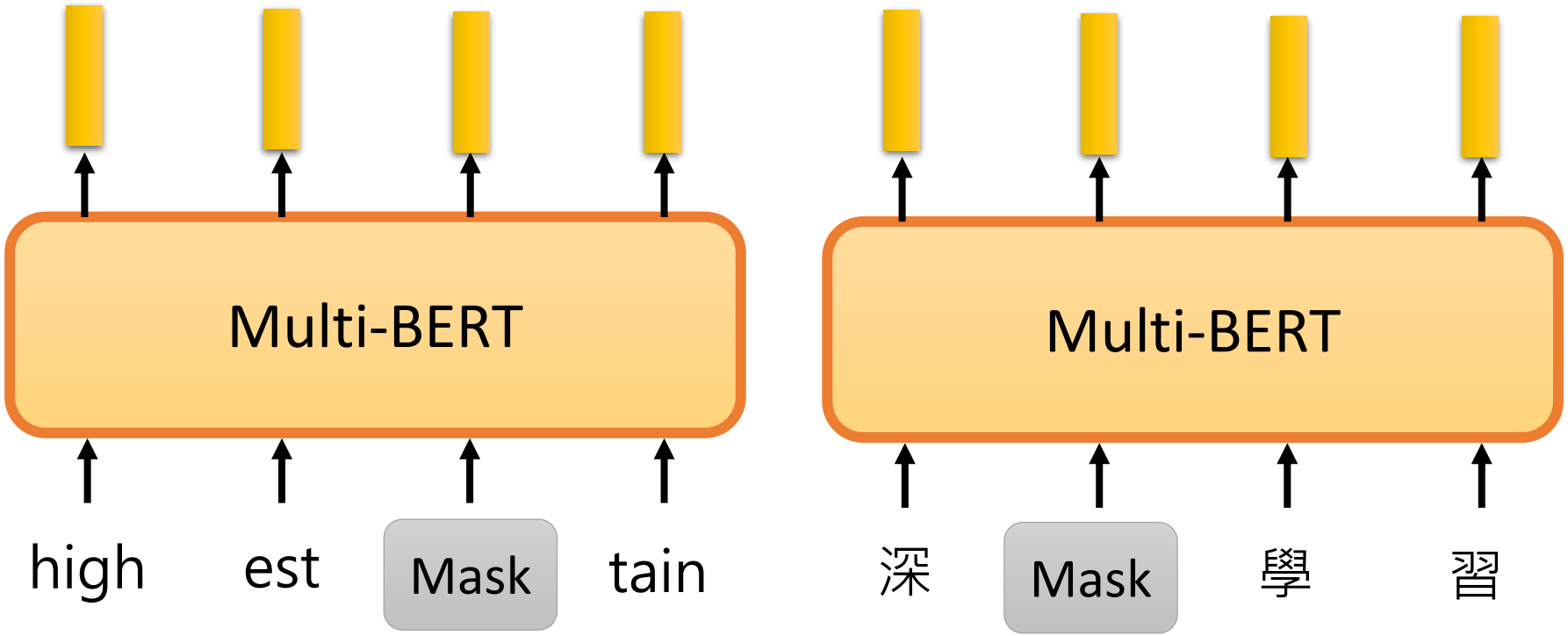
BERT (Part 1)

https://youtu.be/1_gRK9EIQpc

BERT (Part 2)

https://youtu.be/Bywo7m6ySlk

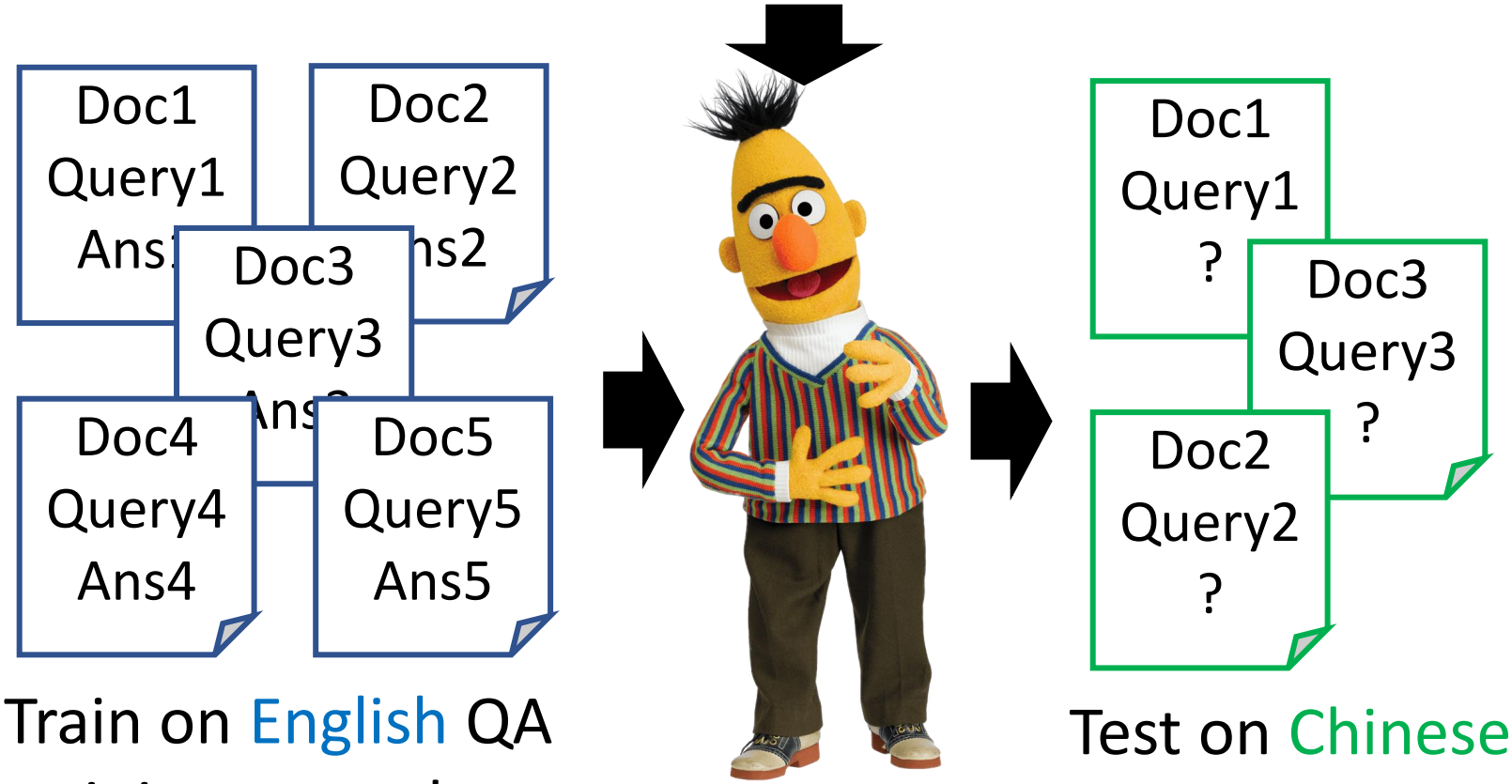
Multi-lingual BERT



Training a BERT model by many different languages.

Zero-shot Reading Comprehension

Training on the sentences of 104 languages



Train on English QA training examples

Multi-BERT

Test on Chinese QA test

Zero-shot Reading Comprehension

- English: SQuAD, Chinese: DRCD

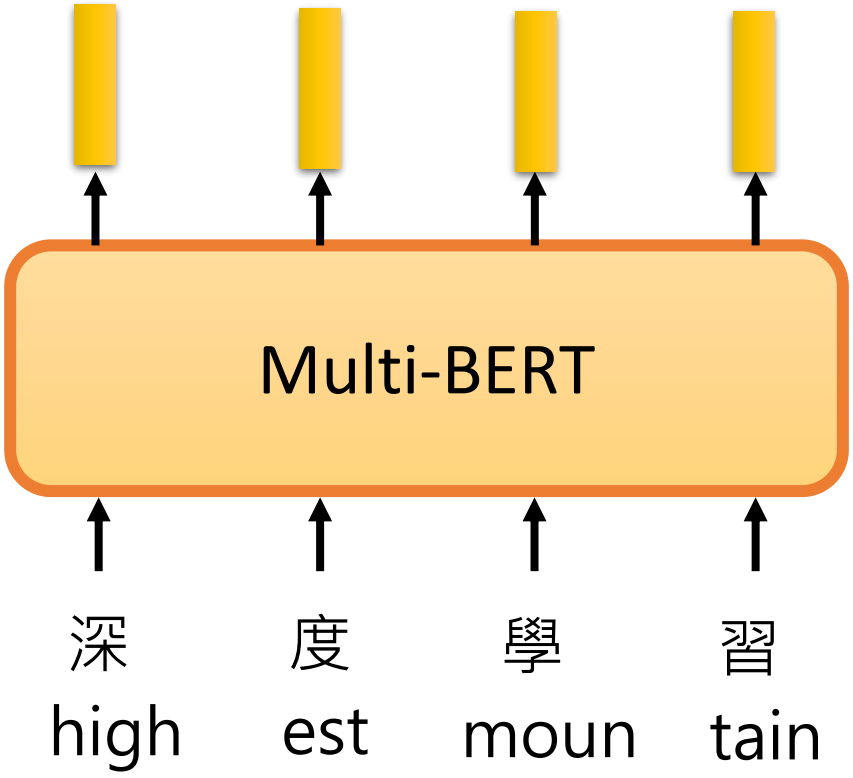
Model	Pre-train	Fine-tune	Test	EM	F1
QANet	none	Chinese	Chinese	66.1	78.1
BERT	Chinese	Chinese		82.0	89.1
	104 languages	Chinese		81.2	88.7
		English		63.3	78.8
		Chinese + English		82.6	90.1

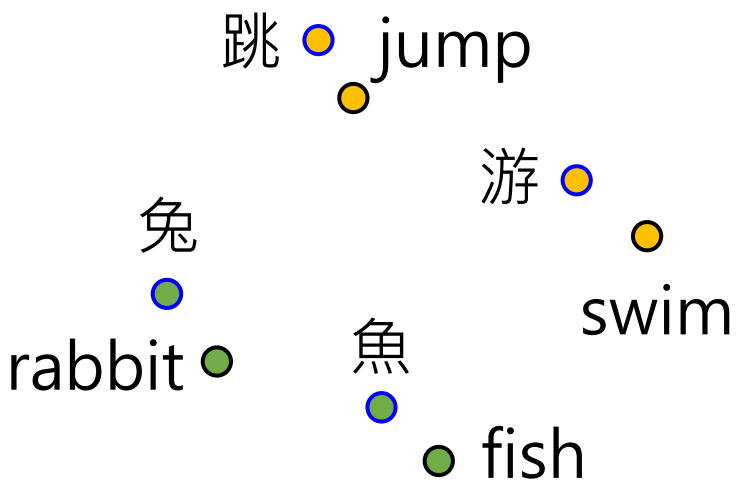
F1 score of Human performance is 93.30%

This work is done by 劉記良、許宗嫄
https://arxiv.org/abs/1909.09587

Cross-lingual Alignment?

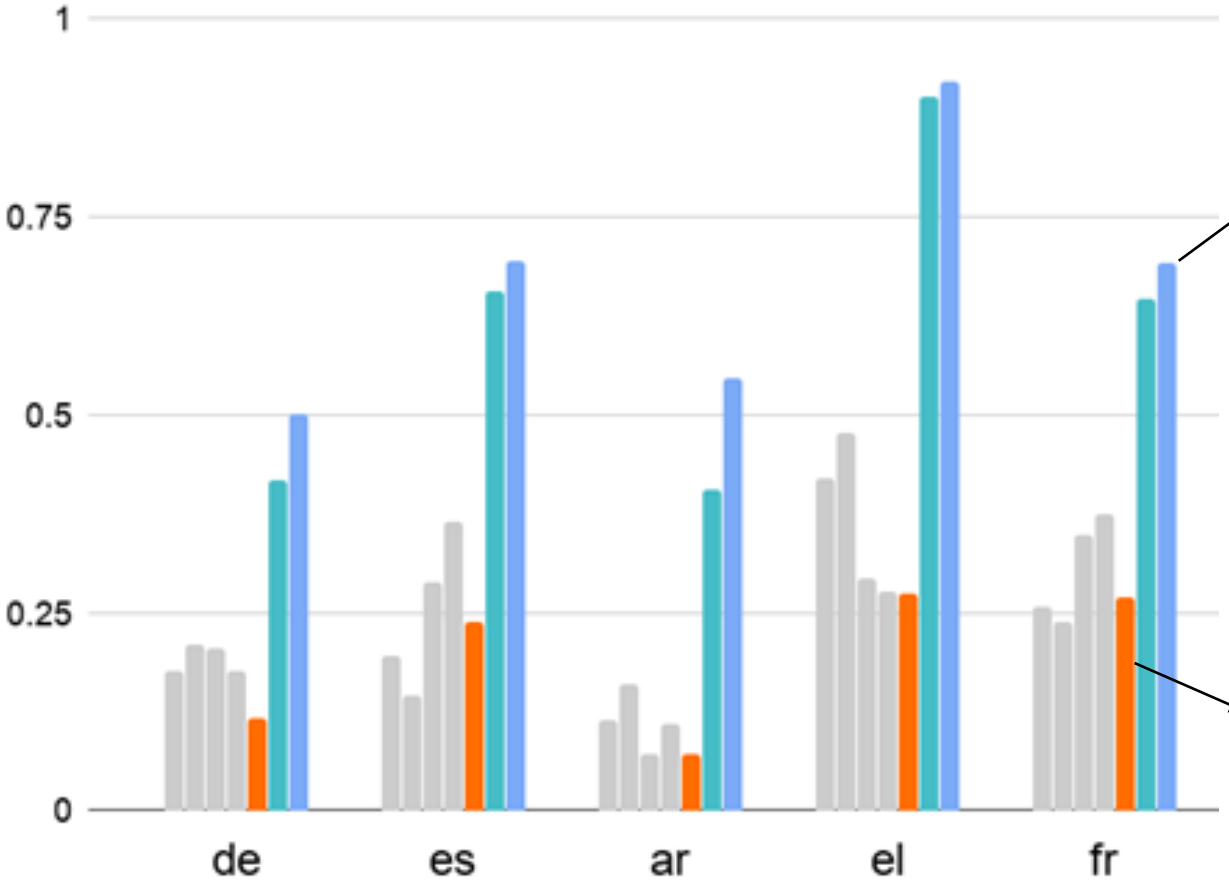
multi-lingual可以做到這件事情，也許是因為，bert會將不同語言相似的詞彙embed到同一個位置附近





Mean Reciprocal Rank (MRR):

Higher MRR, better alignment



Google's Multi-BERT

Our Multi-BERT

200k sentences for each lang

https://arxiv.org/abs/2010.10938

投影片來源: 許宗嫄同學碩士口試投影片

How about 1000k?

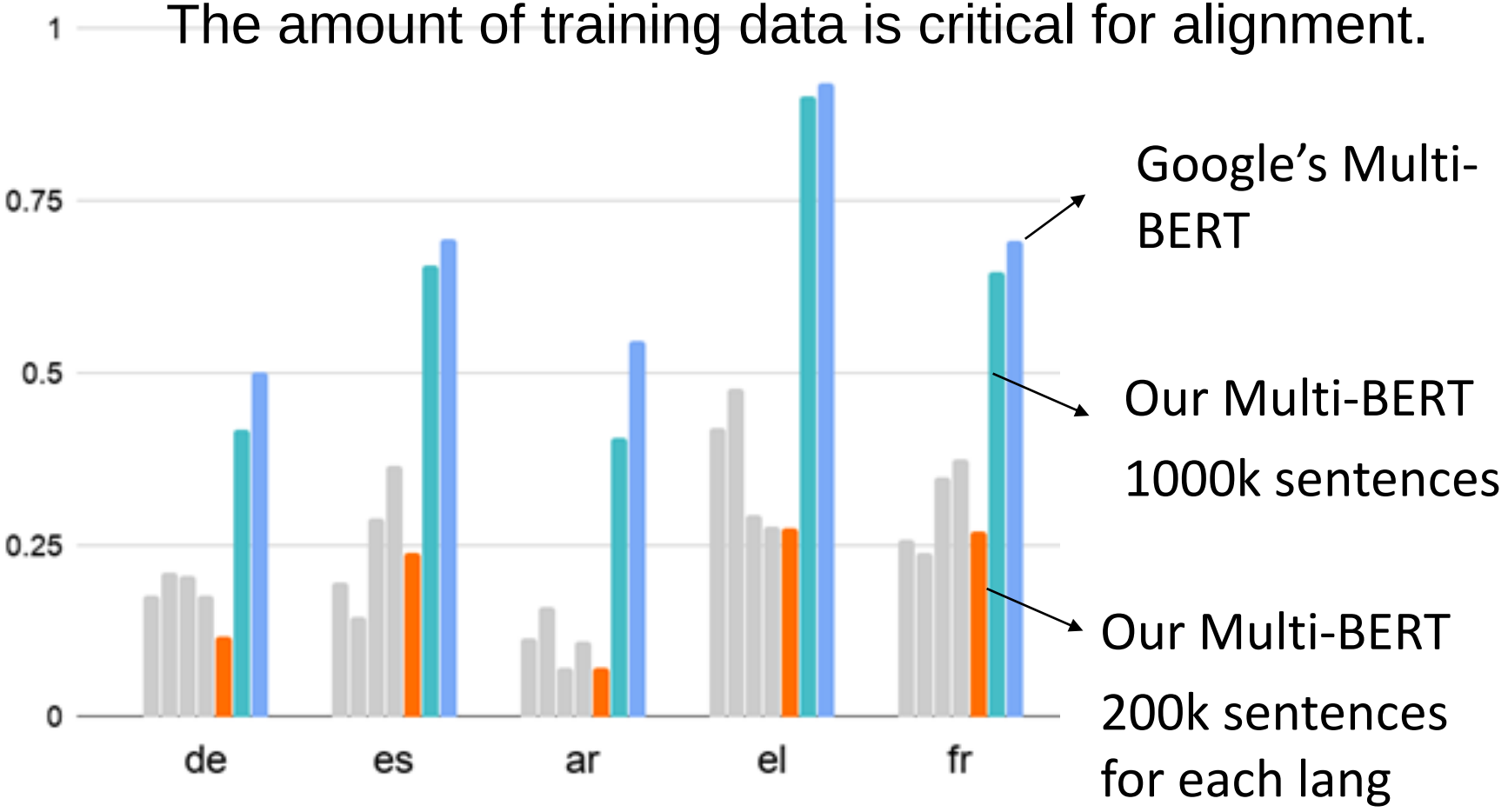
The training is also challenging …

Mean Reciprocal Rank (MRR):

也許需要足夠的資料量才能顯現出能力

Higher MRR, better alignment

The amount of training data is critical for alignment.



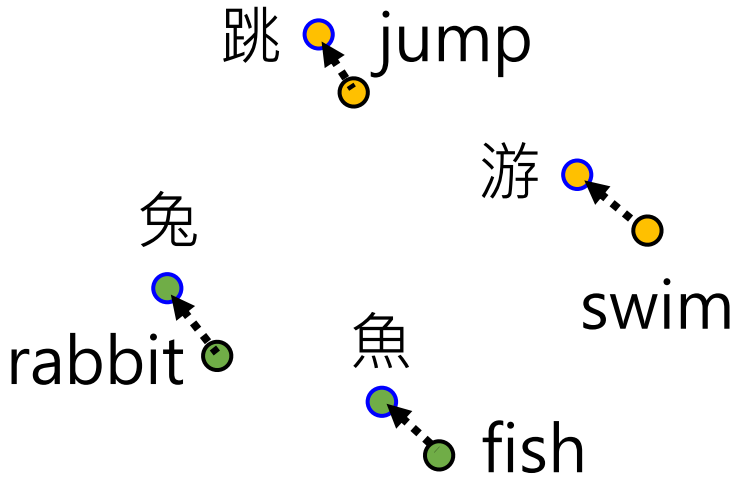
https://arxiv.org/abs/2010.10938

投影片來源: 許宗嫄同學碩士口試投影片

但是給multi-lingual英文的填空問題
他不會給你中文的答案
所以對multi-lingual而言
他其實也不是將相同意思的詞彙embed到很近的位置而已
因為他能知道現在是什麼樣的語言

https://arxiv.org/abs/2010.10041

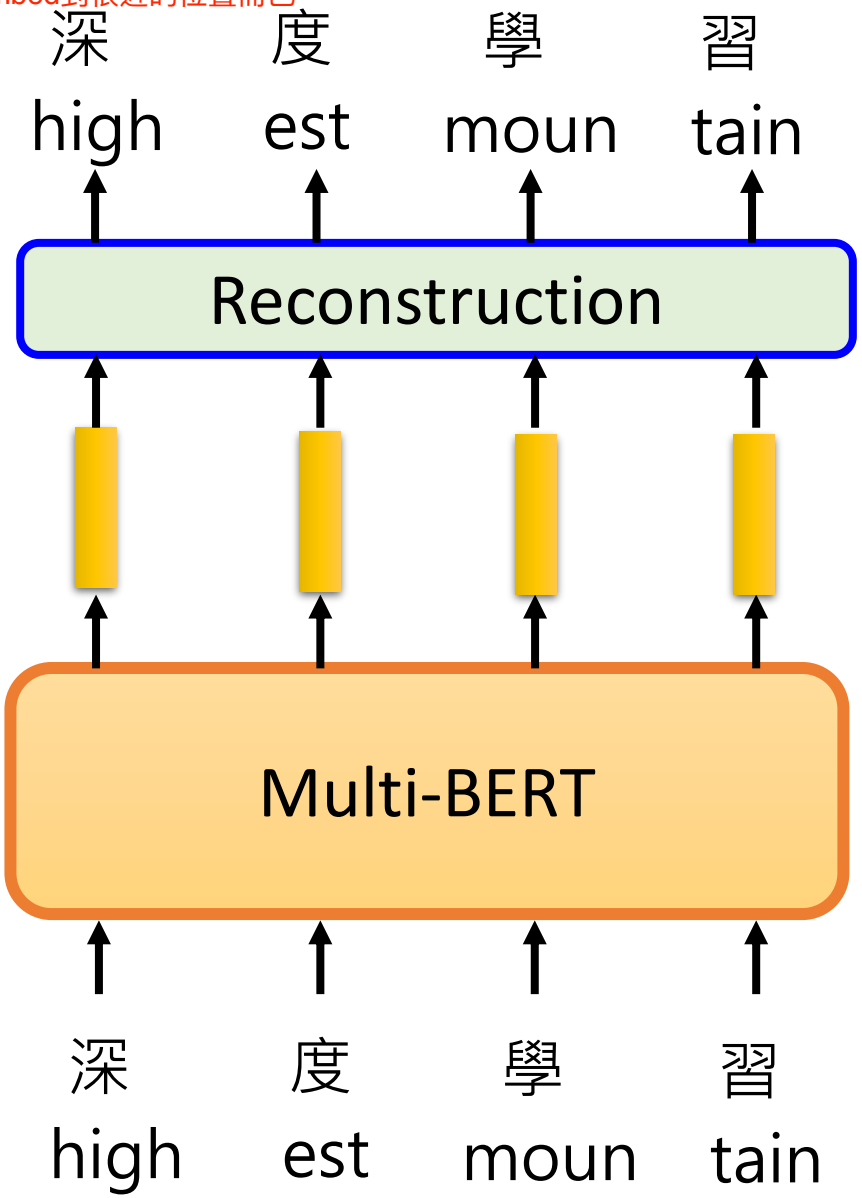
Weird???



If the embedding is language independent …

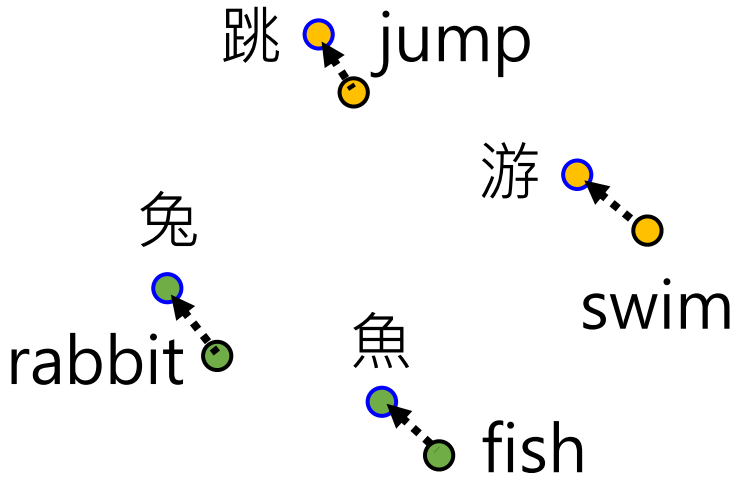
How to correctly reconstruct?

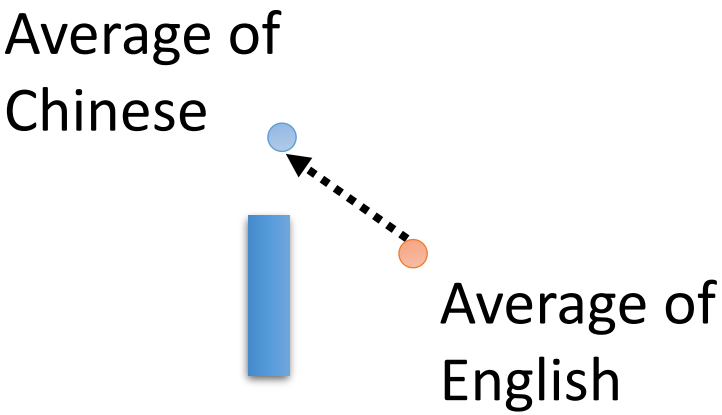
There must be language information.

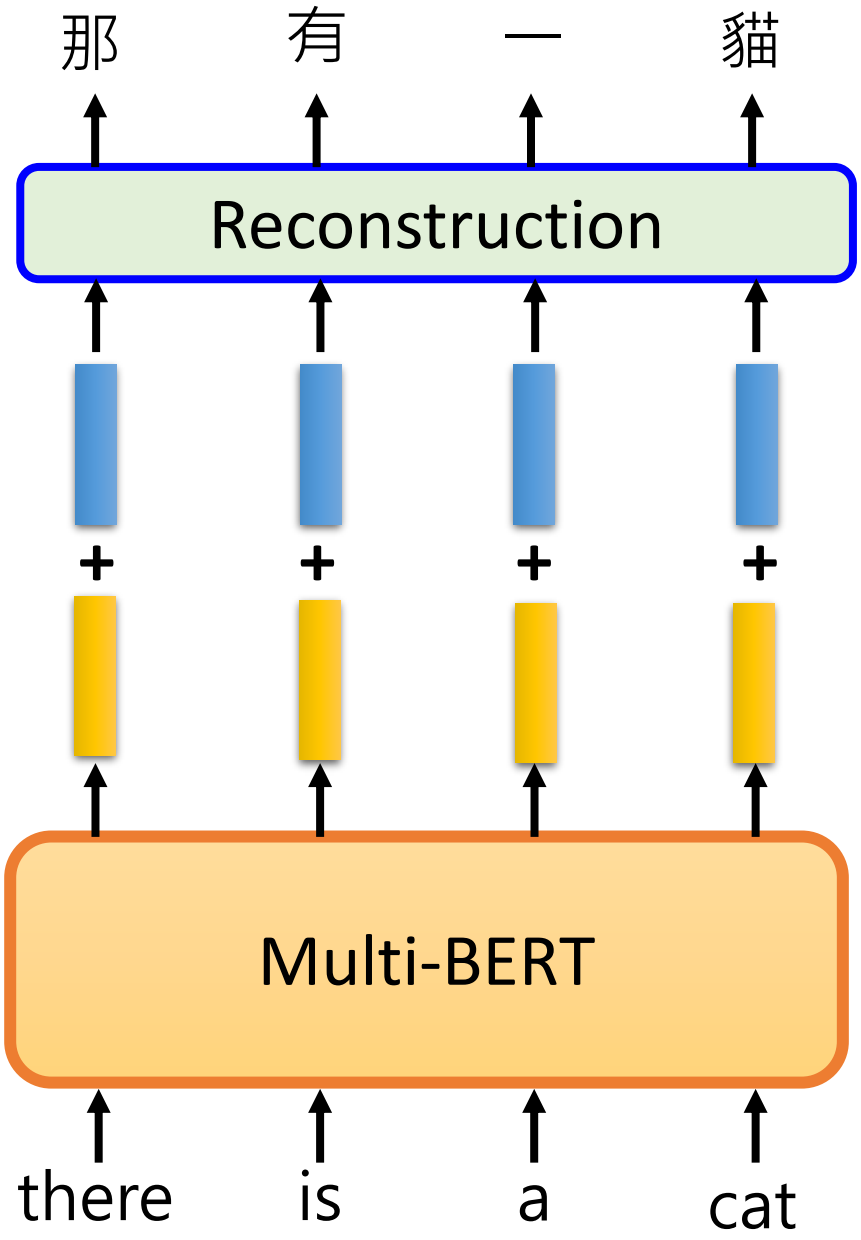


Where is Language?

This work is done by 劉記良、許宗嫄、莊永松

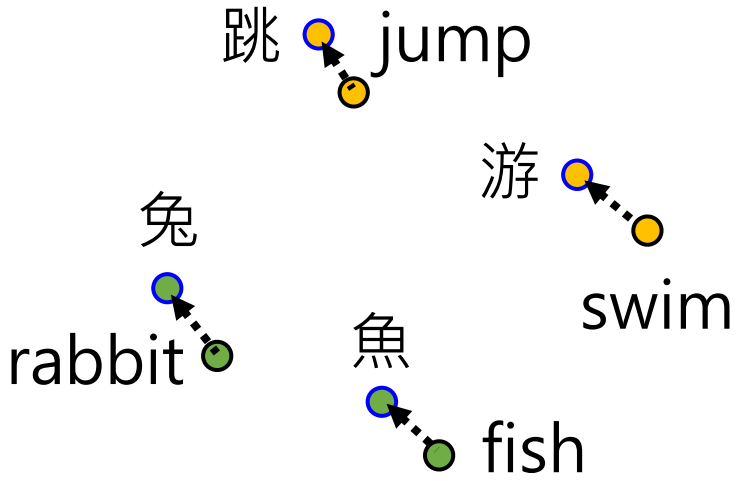


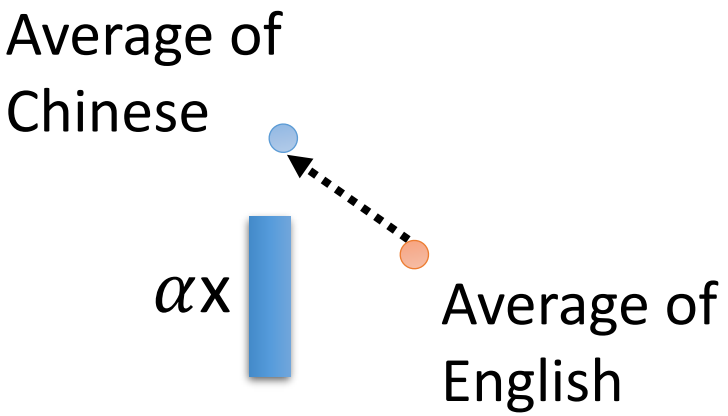




This work is done by 劉記良、許宗嫄、莊永松
https://arxiv.org/abs/2010.10041

If this is true …





Input (en)	The girl that can help me is all the way across town. There is no one who can help me.
Ground Truth (zh)	能帮助我的女孩在小镇的另一边。没有人能帮助我。。
en→zh, $\alpha = 1$	. 孩，can 来我是all the way across 市。。There 是无人人can help 我。
en→zh, $\alpha = 2$	. 孩的的家我是这个人的市。。他是他人人的到我。
en→zh, $\alpha = 3$	。，的的的他是的个的的，。： 他是他人，的。他。

Unsupervised token-level translation ☺

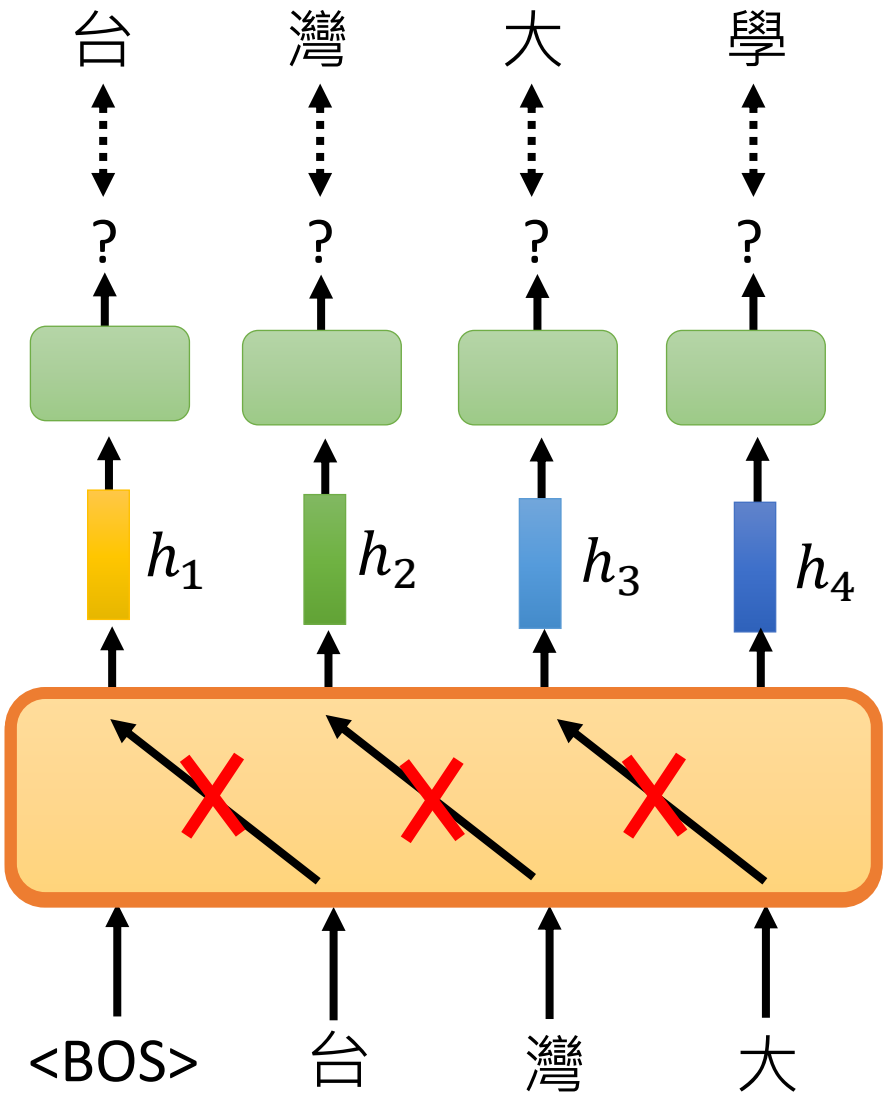
Outline

BERT series

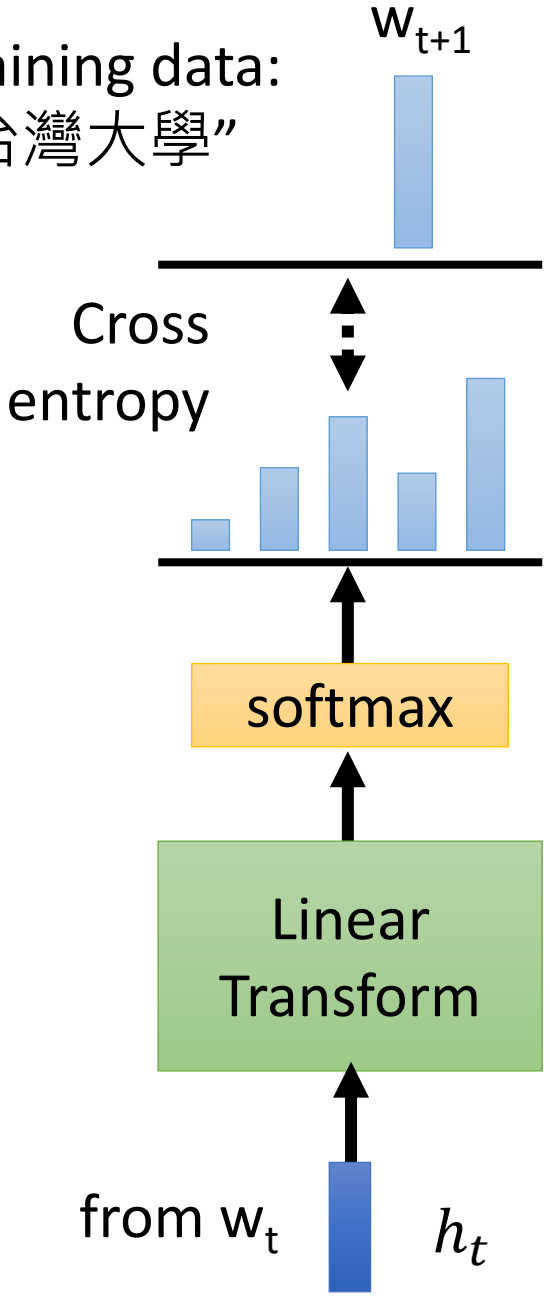
GPT series

他在訓練的時候就是在預測下一個詞彙
因此他具有generation的能力

Predict Next Token



Training data:
“台灣大學”



https://talktotransformer.com/

Predict Next Token

They can do generation.

EM PROMPT
-WRITTEN)

In a shocking finding, scientist discovered a [illegible] in a remote, previously unexplored valley, in the A[illegible]des Mount[illegible]ins. Even more surprising to the researchers was the fact that the unicorns spoke perfect English.

MODEL
MPLETION
(MACHINE-
10 TRIES)

The scientist named the population, after their distinctive horn, Ovid's Unicorn. These four-horned, silver-white unicorns were previously unknown to science.

Now, after almost two centuries, the mystery of what sparked this odd phenomenon is finally solved.

Dr. Jorge Pérez, an evolutionary biologist from the University of La Paz, and several companions, were exploring the Andes Mountains when they found a small valley, with no other animals or humans. Pérez noticed that the valley had what appeared to be a natural fountain, surrounded by two peaks of rock and silver snow.

How to use GPT?

第一部份： 詞彙和結構
本部份共 15 題，每題含一個空格。請就試題冊上 A、B、C、D 四個選項中選出最適合題意的字或詞，標示在答案紙上。

Description

例：

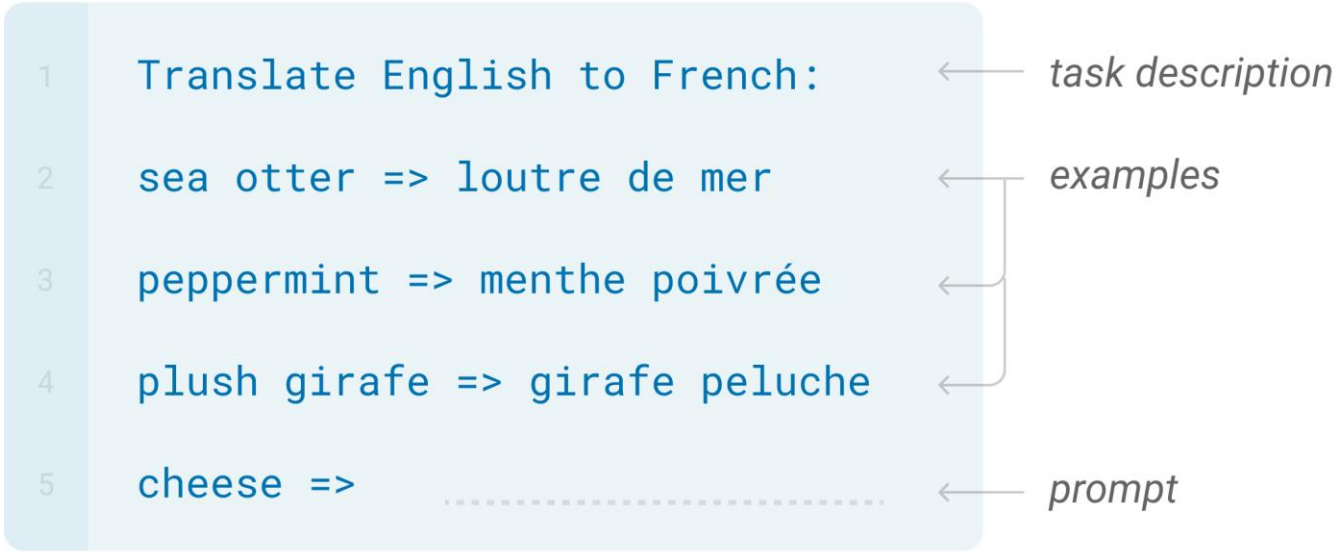
It's eight o'clock now. Sue _____ in her bedroom.
A. study
B. studies
C. studied
D. is studying

正確答案為 D，請在答案紙上塗黑作答。

A few example

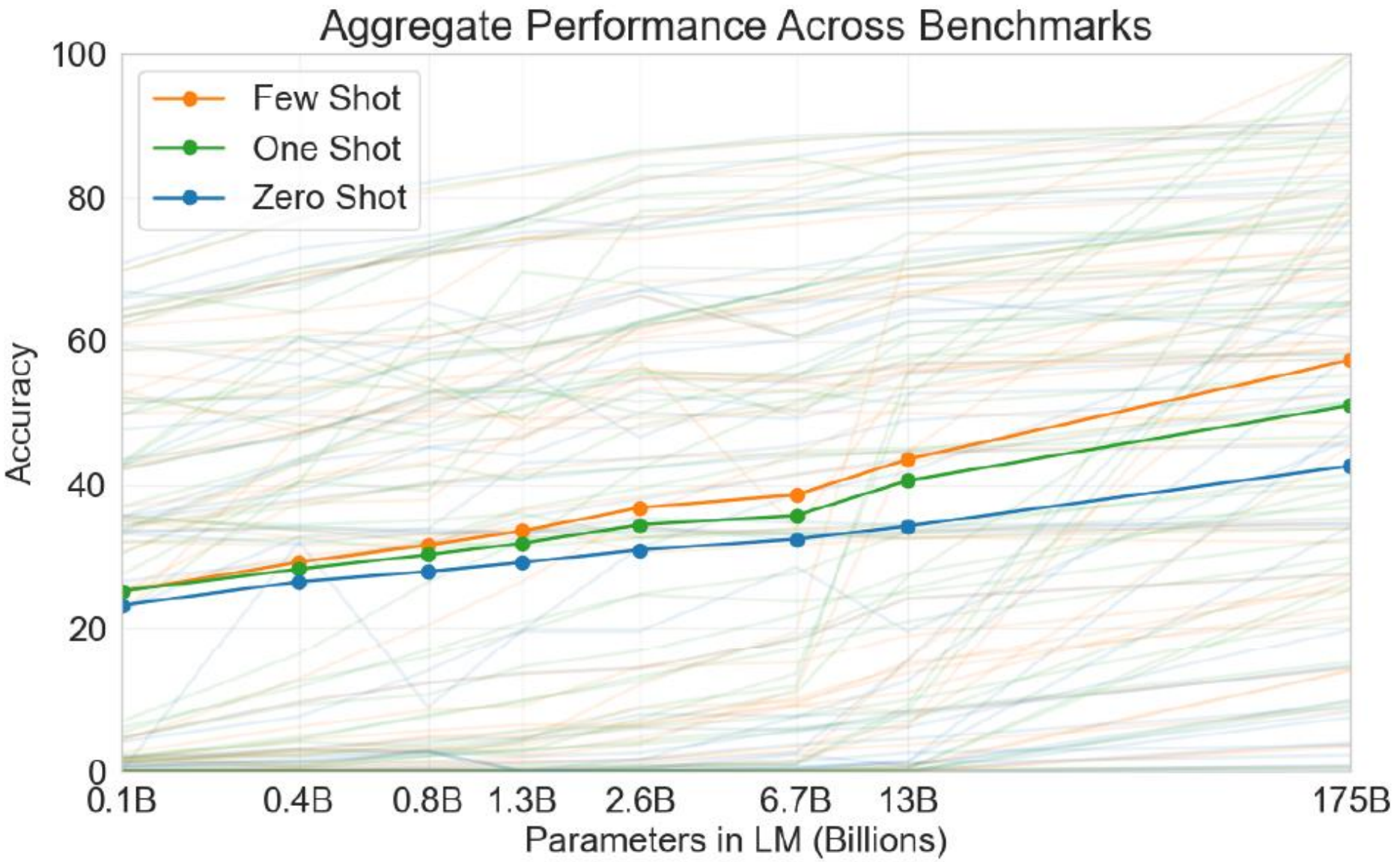
"Few-shot" Learning

(no gradient descent)



還有one-shot learning(只給一個例子)和zero-shot learning(不給例子)

"In-context" Learning



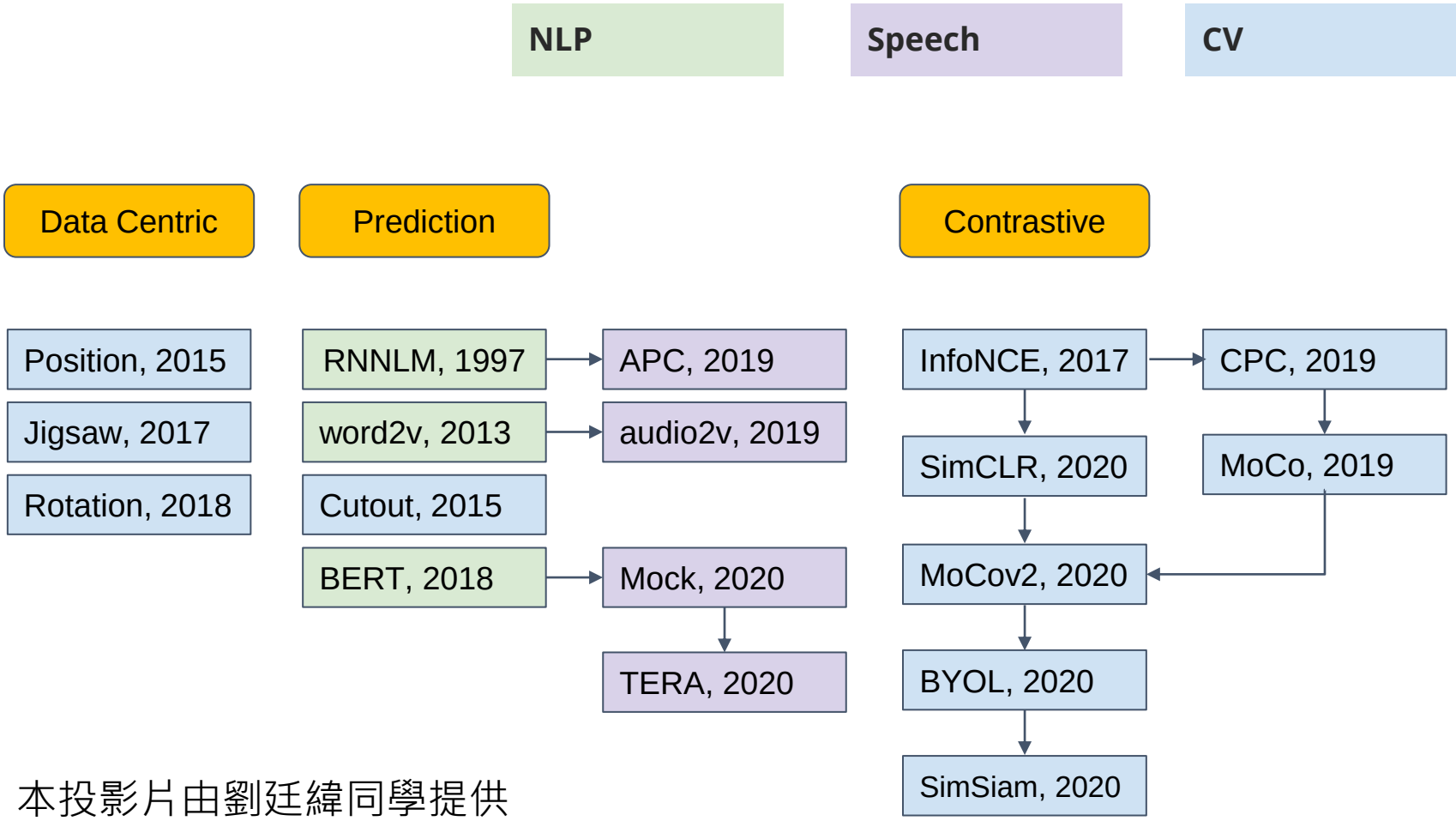
Average of **42** tasks

有些任務可以做得很好，
有些任務怎麼學都學不會
e.g. 邏輯推理的任務，就學不好

To learn more ……

https://youtu.be/DOG1L9lvsDY

Beyond Text



本投影片由劉廷緯同學提供

Image - SimCLR

https://arxiv.org/abs/2002.05709
https://github.com/google-research/simclr

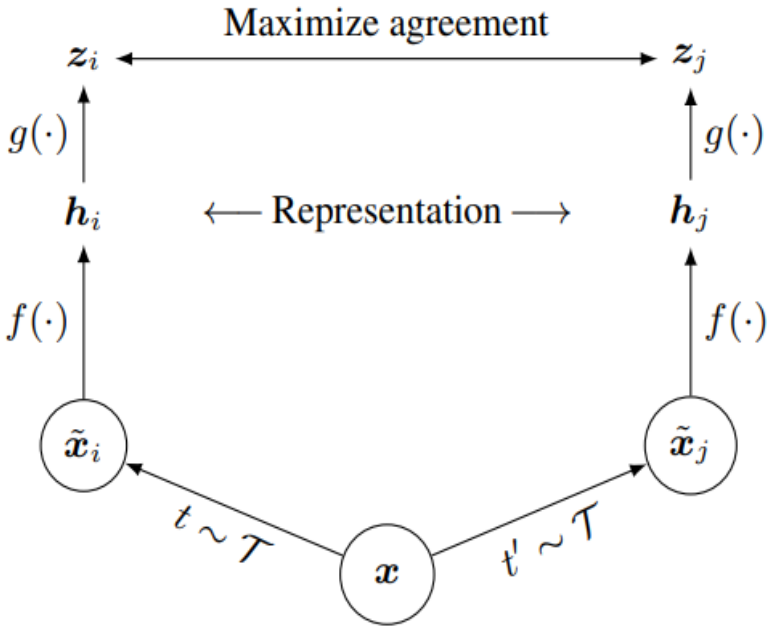
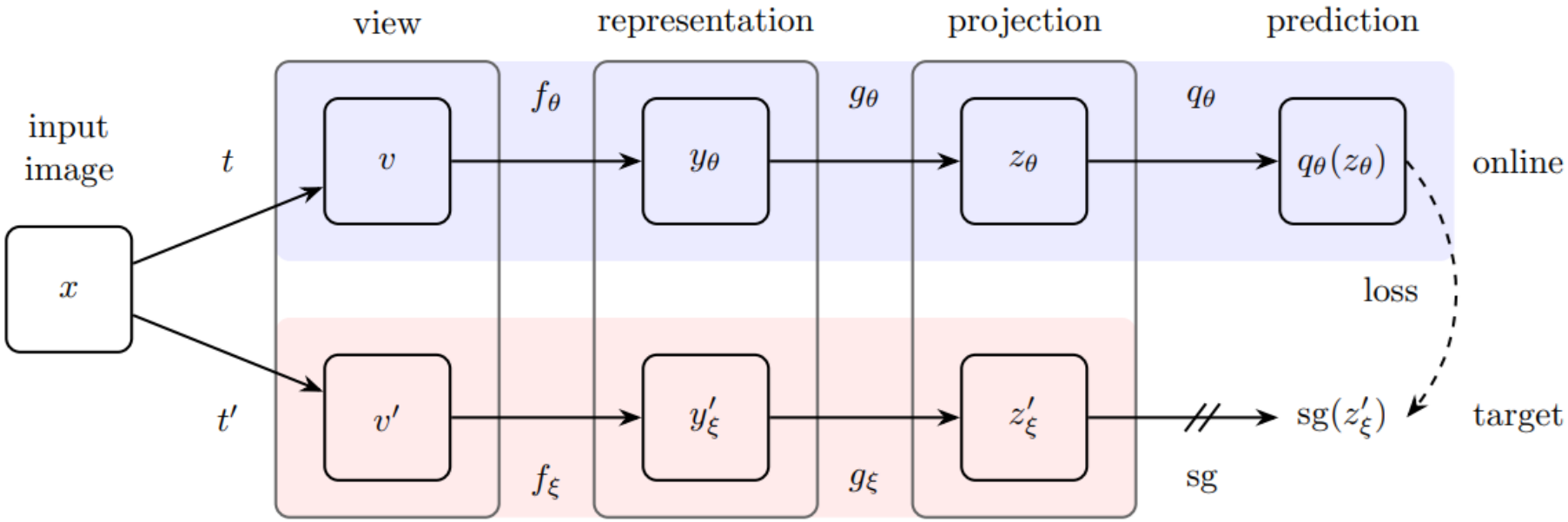


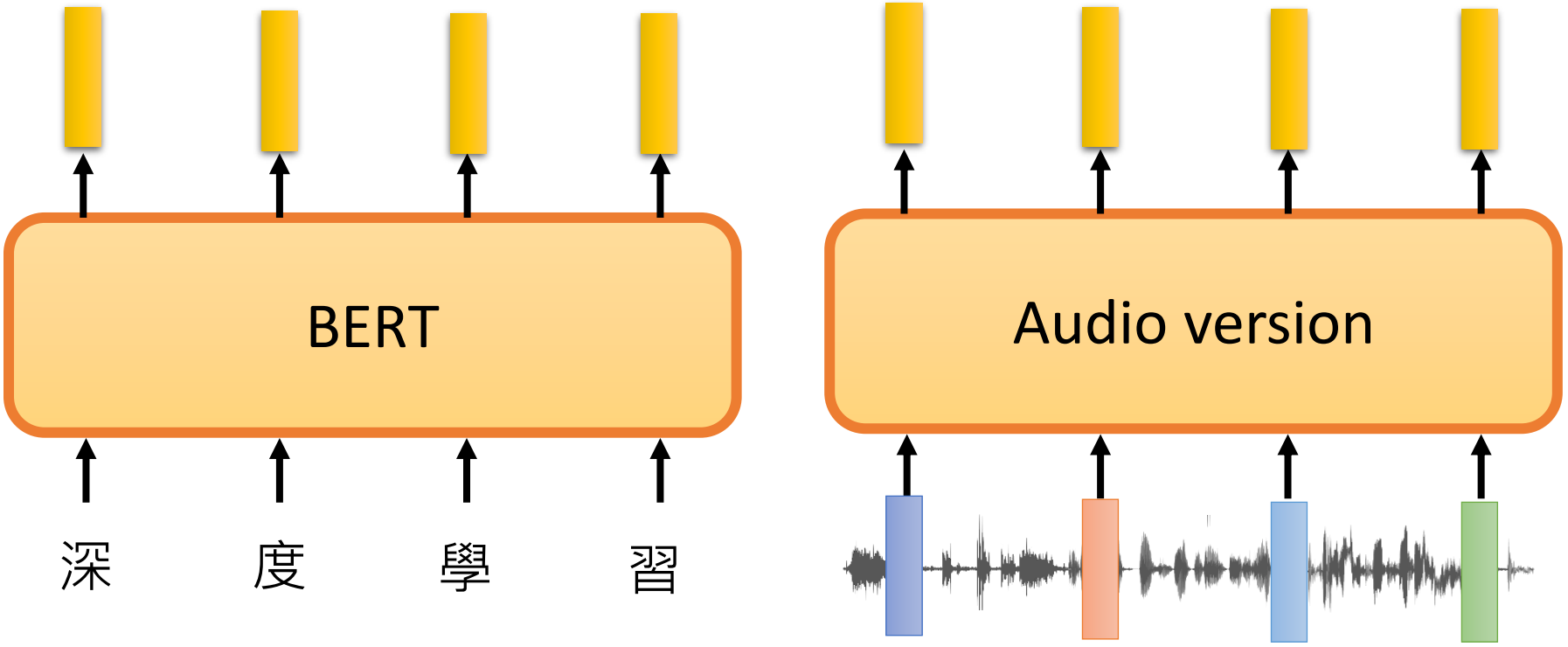
Image - BYOL

Bootstrap **y**our **o**wn **l**atent:
A new approach to self-supervised Learning

https://arxiv.org/abs/2006.07733

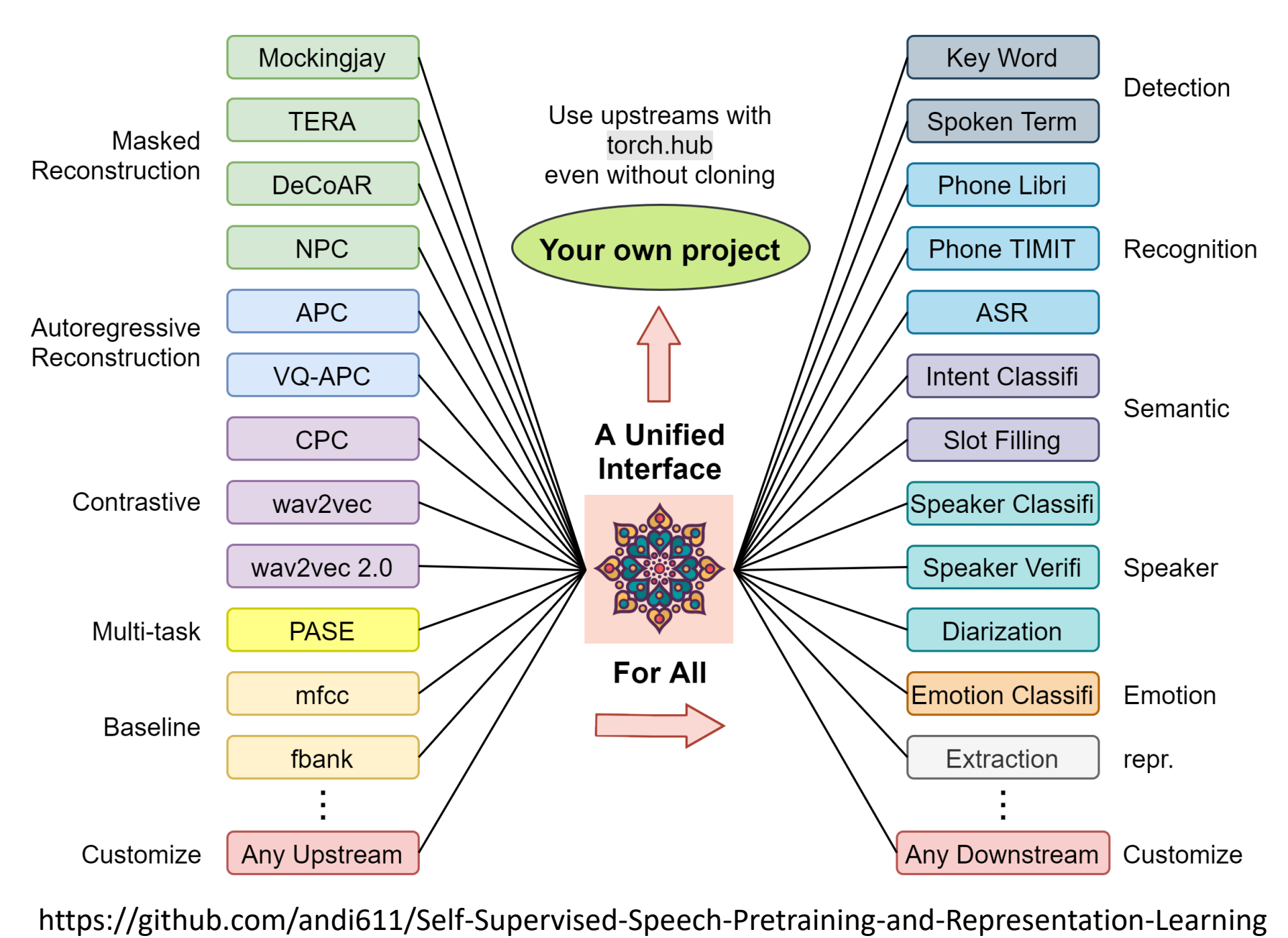


Speech



Speech GLUE - SUPERB

- **S**peech processing **U**niversal **PER**formance **B**enchmark
  - Will be available soon
- **Downstream:** Benchmark with 10+ tasks
  - The models need to know how to process content, speaker, emotion, and even semantics.
- **Toolkit:** A flexible and modularized framework for self-supervised speech models.
  - https://github.com/s3prl/s3prl



https://github.com/andi611/Self-Supervised-Speech-Pretraining-and-Representation-Learning

Appendix

(a joke)

Predict Next Token

They can do generation.

BATMAN

INT. TRADITIONAL BATCAVE

BATMAN stands next to his batmobile and uses his batcomputer. He's sometimes Bruce Wayne sometimes Batman. Alltimes orphan.

BATMAN
This is now a safe city. I have punched a penguin into prison.

ALFRED, Batman's loyal batler, carries a tray of goth ham.

ALFRED
Eat a dinner, Mattress Wayne.

An explosion explodes. THE JOKER and TWO-FACE enter the cave. Joker is a clown but insane. Two-Face is a man but attorney.

律師

BATMAN
No! It is Two-Face and One-Face. They hate me for being a bat.

Batman throws Alfred at Two-Face. Two-Face flips Alfred like a coin. Alfred lands heads up which means Two-Face goes home.

BATMAN (CONT'D)
It is just you and I, the Joker. Bat versus clown. Moral enemies.

THE JOKER
I am such a freak. Society is bad.
You drink water, I drink anarchy.

混亂

BATMAN
I drink bats just like a bat would!

Batman looks around for his parents, but they are still dead. This makes him have anger. He fires a batrocket. The Joker deflects it with his sick sense of humor. A clownly power.

THE JOKER
I have never followed a rule. That is my rule. Do you follow? I don't.

BATMAN
Alfred, give birth to Robin.

Alfred begins the process since it is his job. The Joker now has a present in his hand. He juggles it over to Batman.

THE JOKER
Happy batday, Birthman.

Batman opens the present since he's a good guy. It contains a coupon for new parents, but is expired. This is a Joker joke.

I forced a bot to watch over 1,000 hours of XXX

是一個梗!

人在模仿機器模仿人!!!