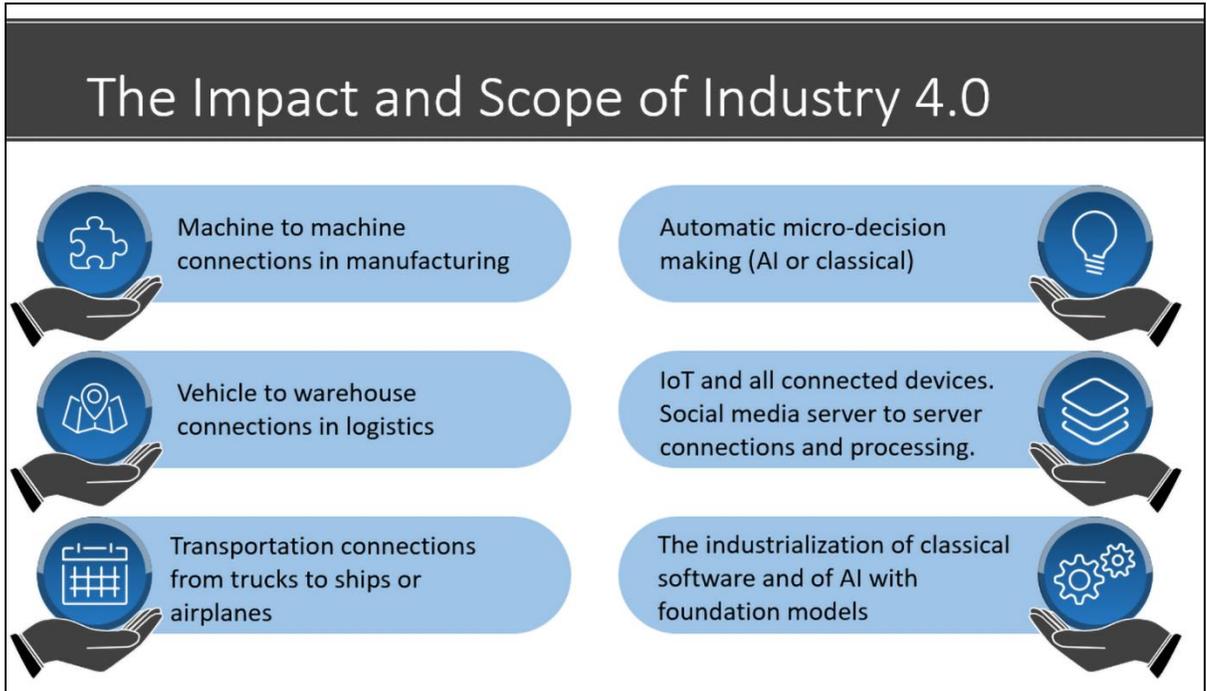


## Chapter 1: What Are Transformers?



# The new paradigm of AI



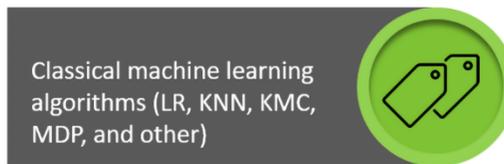
Foundation models that can do all NLP tasks, CV, and more with one model!



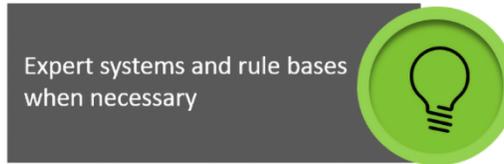
Partially trained-transformer models that can do one or a few tasks



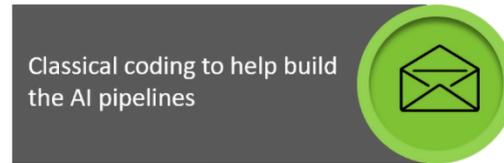
Classical deep learning tasks when sufficient



Classical machine learning algorithms (LR, KNN, KMC, MDP, and other)

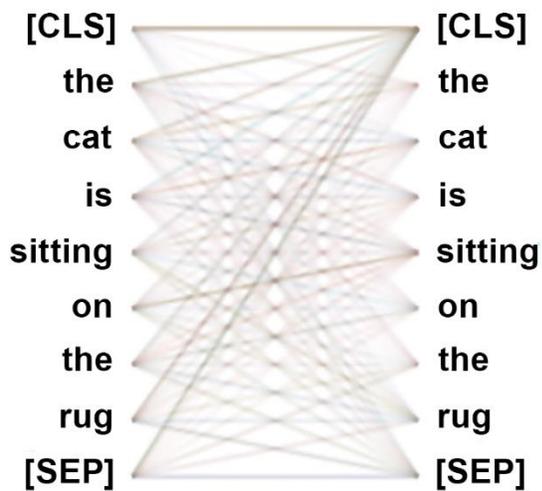


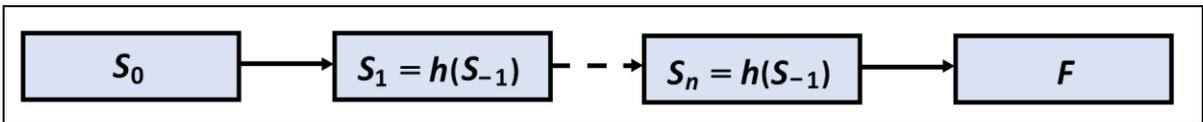
Expert systems and rule bases when necessary



Classical coding to help build the AI pipelines

Layer: 0 ▾





**Document**

A user visited the AllenNLP website, tried a transformer model, and found it interesting.

**Run Model**

**Model Output**

A user visited the AllenNLP website, tried **0** a transformer model , and found **0** it interesting.

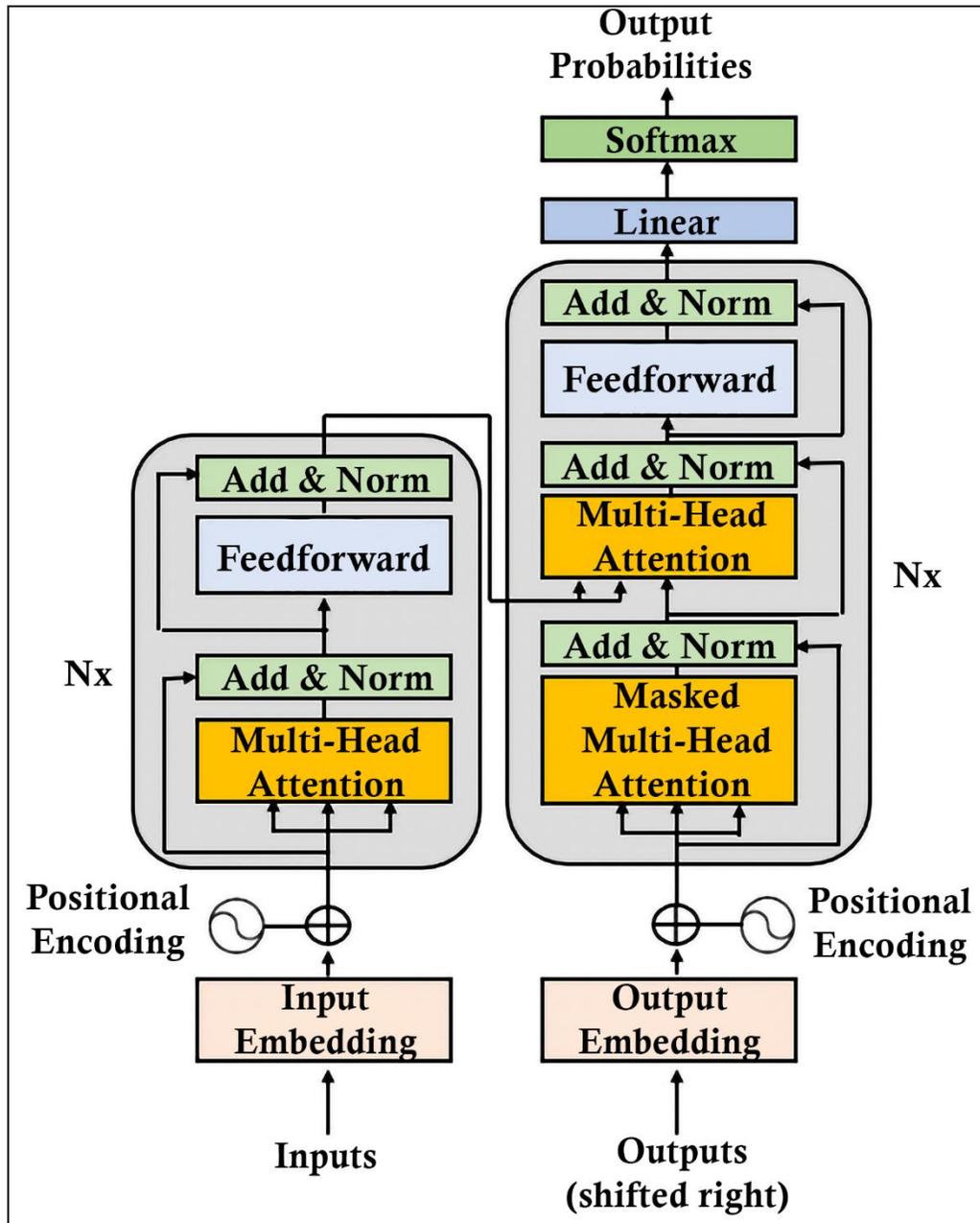
English  ↔  French

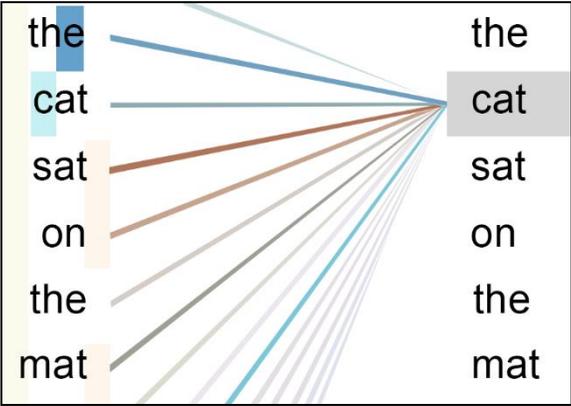
A user visited the AllenNLP website, tried a transformer model, and found it interesting.

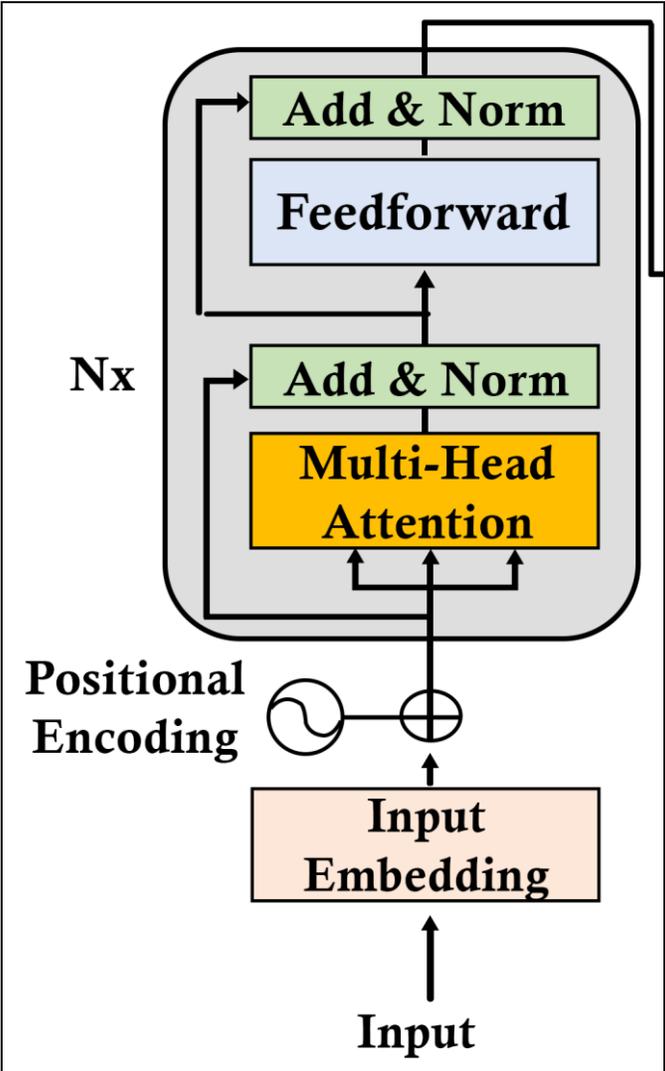
Un utilisateur a visité le site Web AllenNLP, a essayé un modele de transformateur et l'a trouvé intéressant.

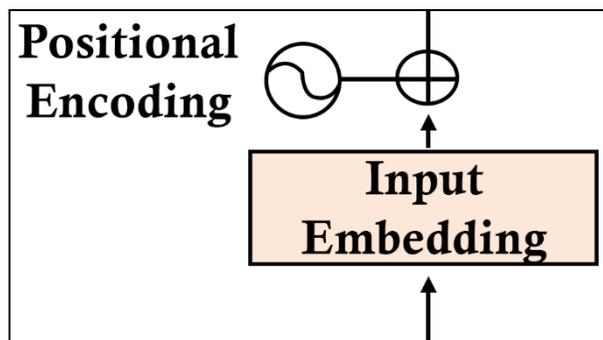
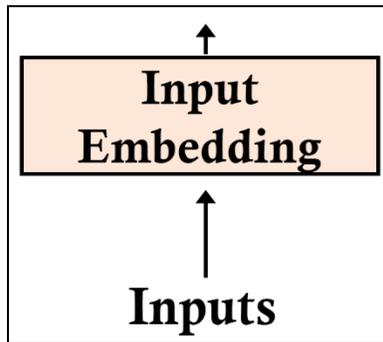


## Chapter 2: Getting Started with the Architecture of the Transformer Model

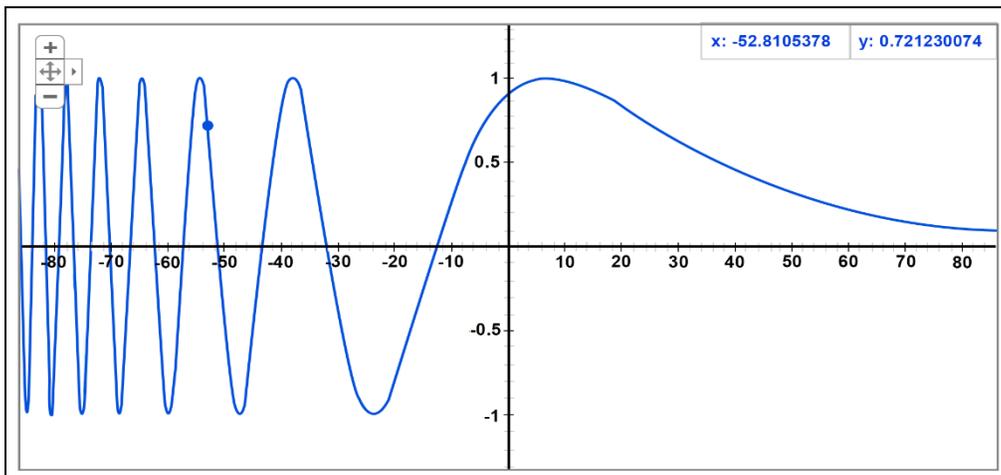


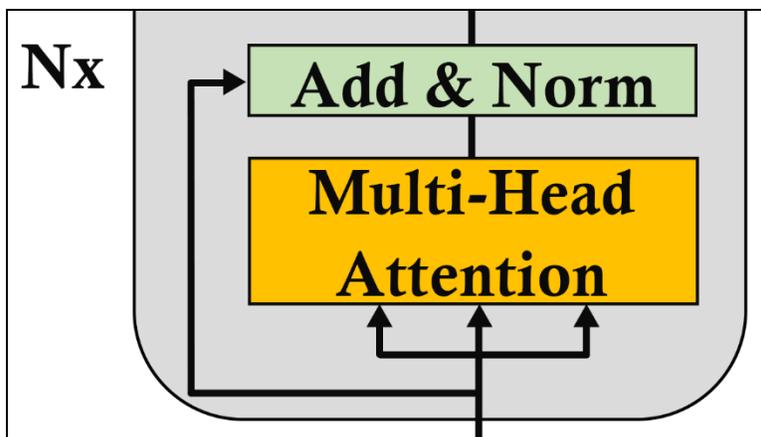
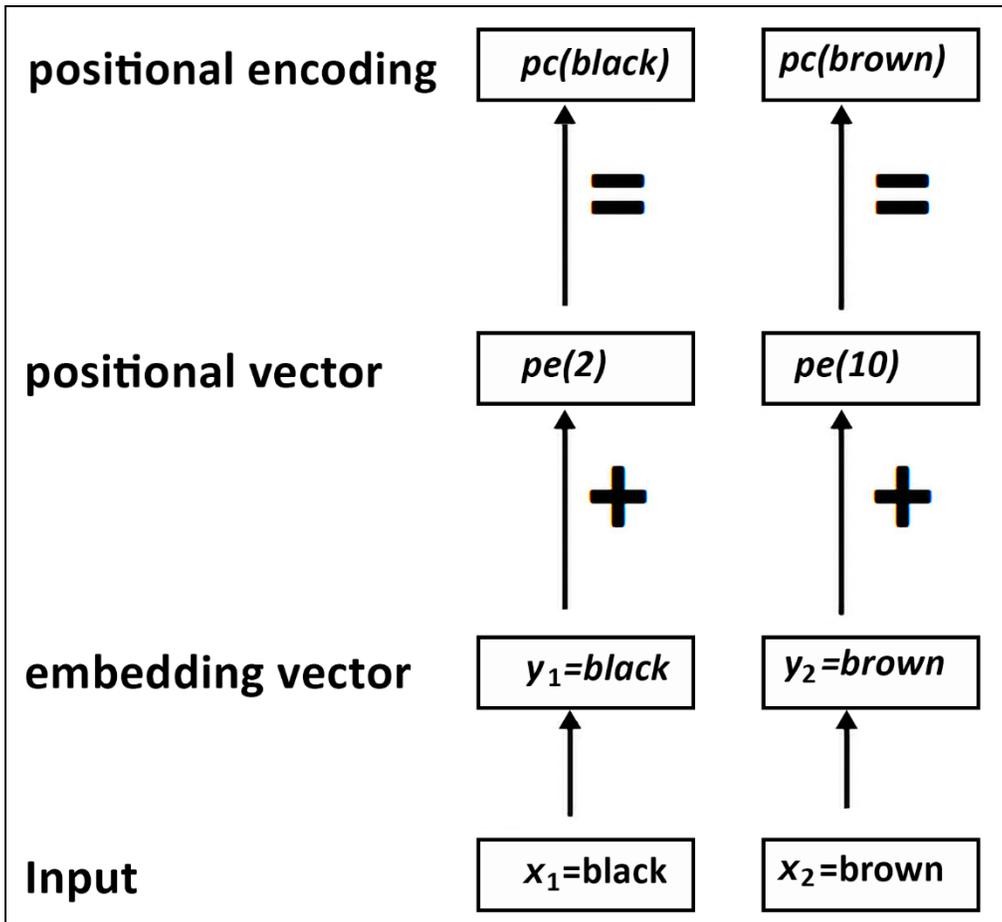


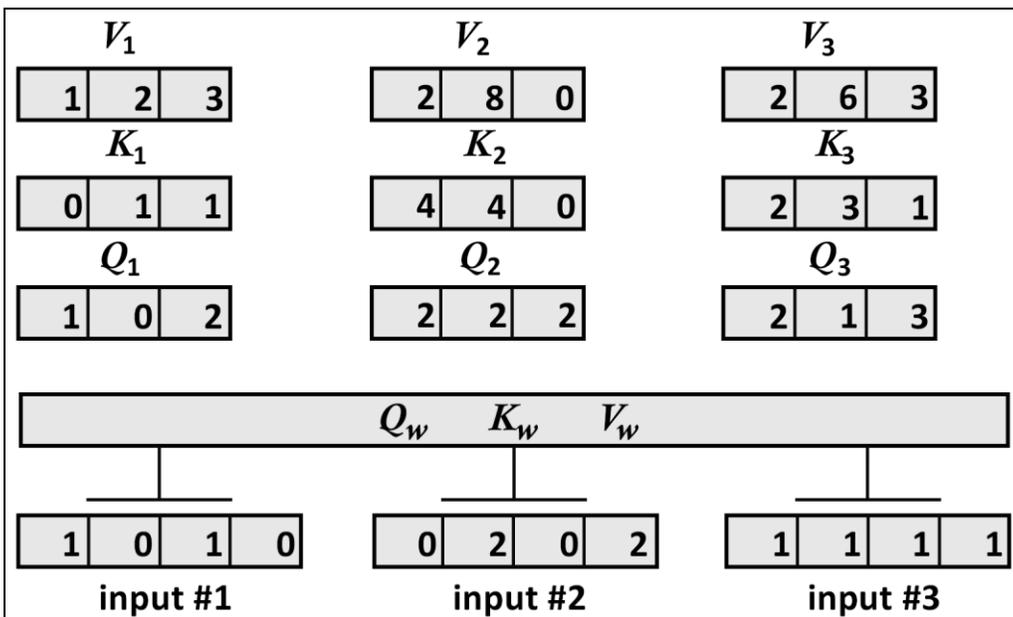
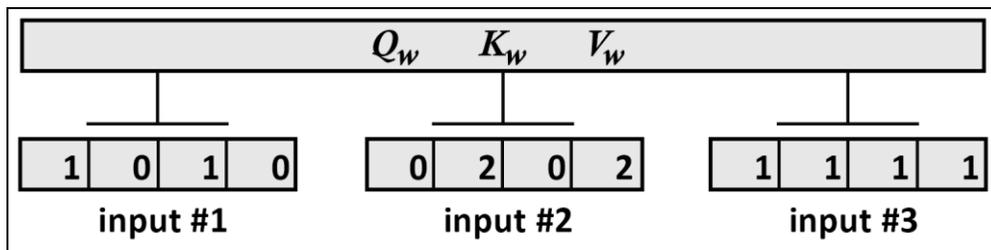
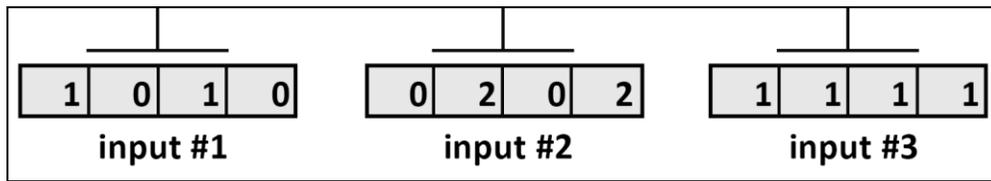
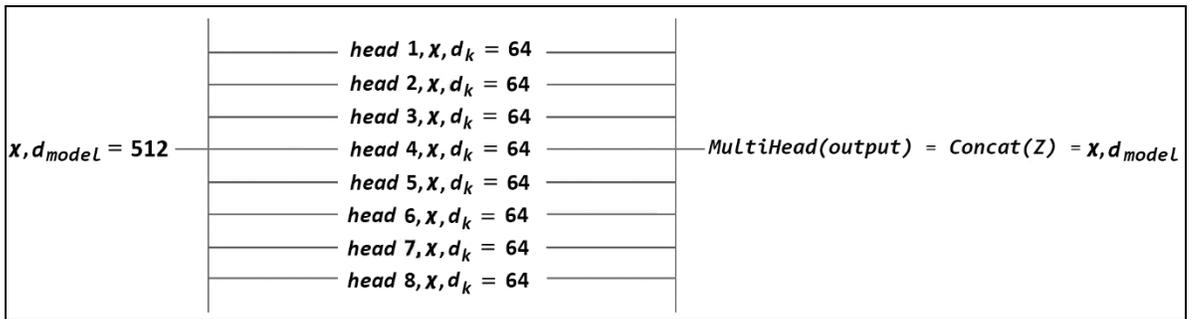




```
plot y=sin(2/10000^(2*x/512))|
```







*Score of Input # 1 =  $Q_1 * K$  (all 3 keys)*

2

4

4

$K_1$

$K_2$

$K_3$

0 1 1

4 4 0

2 3 1

$Q_1$

$Q_2$

$Q_3$

1 0 2

2 2 2

2 1 3

$Q_w$   $K_w$   $V_w$

—

—

—

1 0 1 0

0 2 0 2

1 1 1 1

input #1

input #2

input #3

*Softmax(Score of Input # 1 =  $Q_1 * K$ )*

0.06

0.46

0.46

$K_1$

0	1	1
---	---	---

$K_2$

4	4	0
---	---	---

$K_3$

2	3	1
---	---	---

$Q_1$

1	0	2
---	---	---

$Q_2$

2	2	2
---	---	---

$Q_3$

2	1	3
---	---	---

$Q_w$   $K_w$   $V_w$

1	0	1	0
---	---	---	---

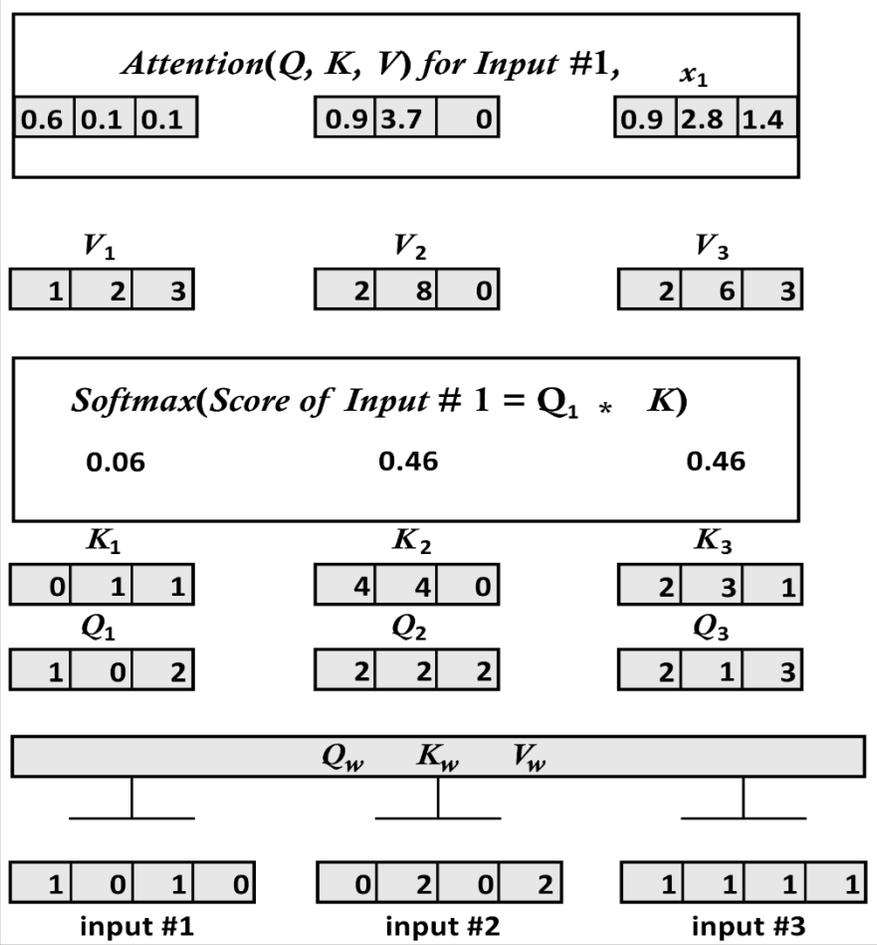
input #1

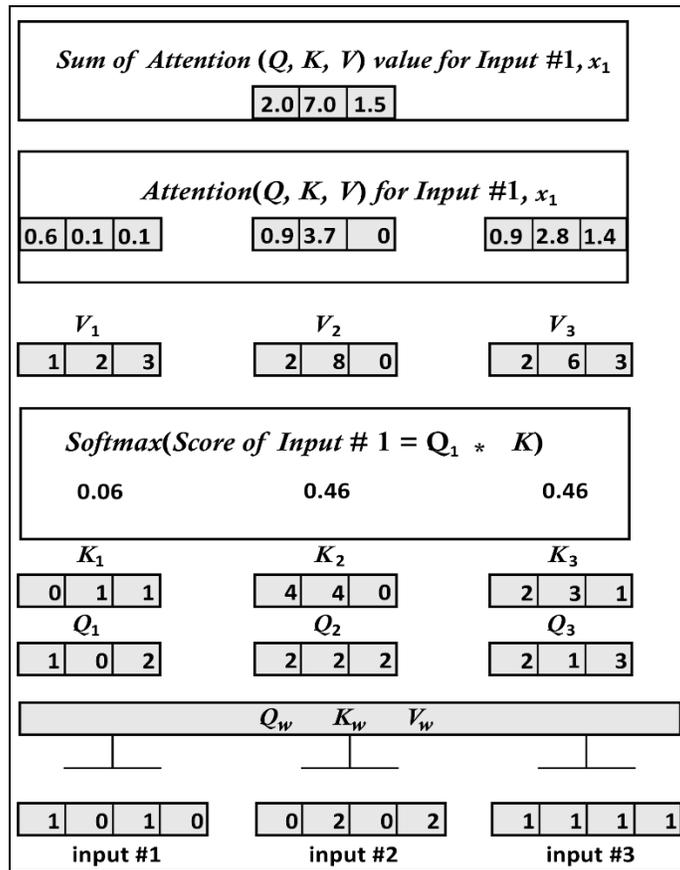
0	2	0	2
---	---	---	---

input #2

1	1	1	1
---	---	---	---

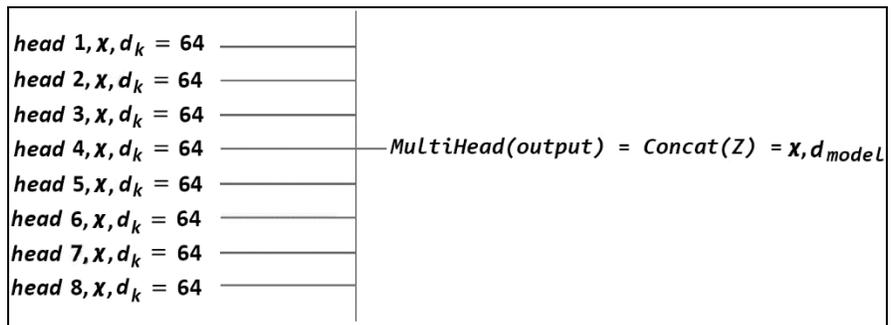
input #3

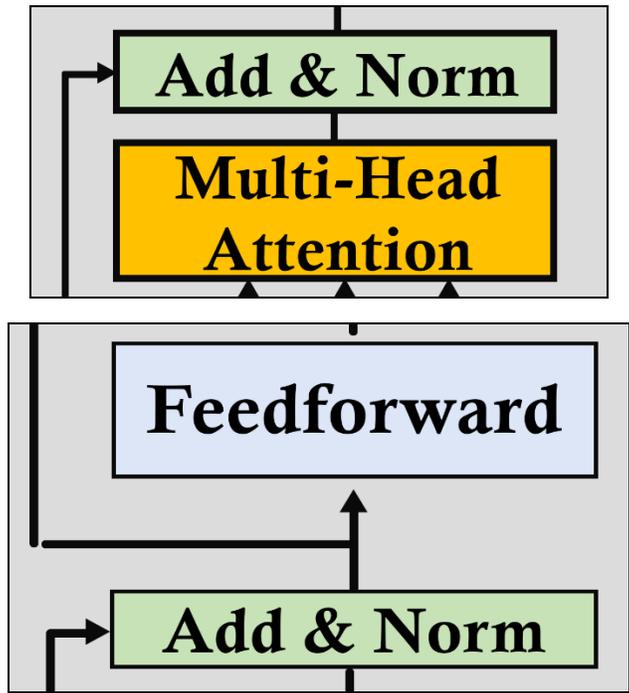


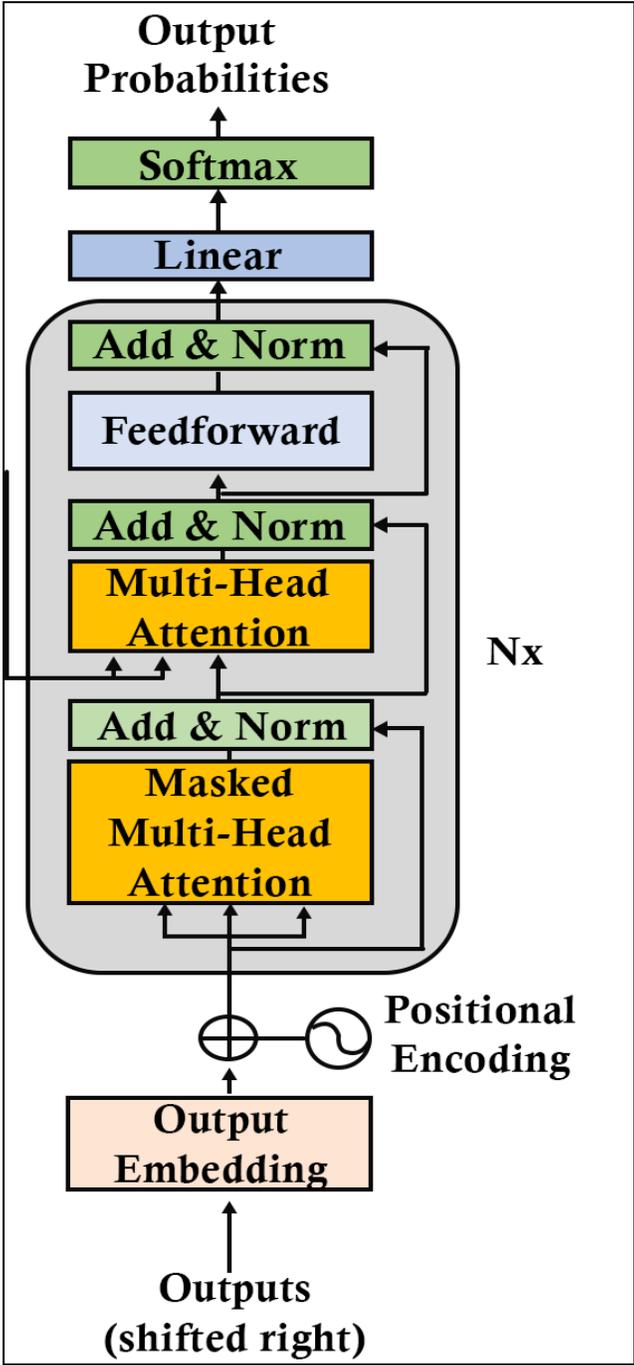


**multi-headed attention layer output**

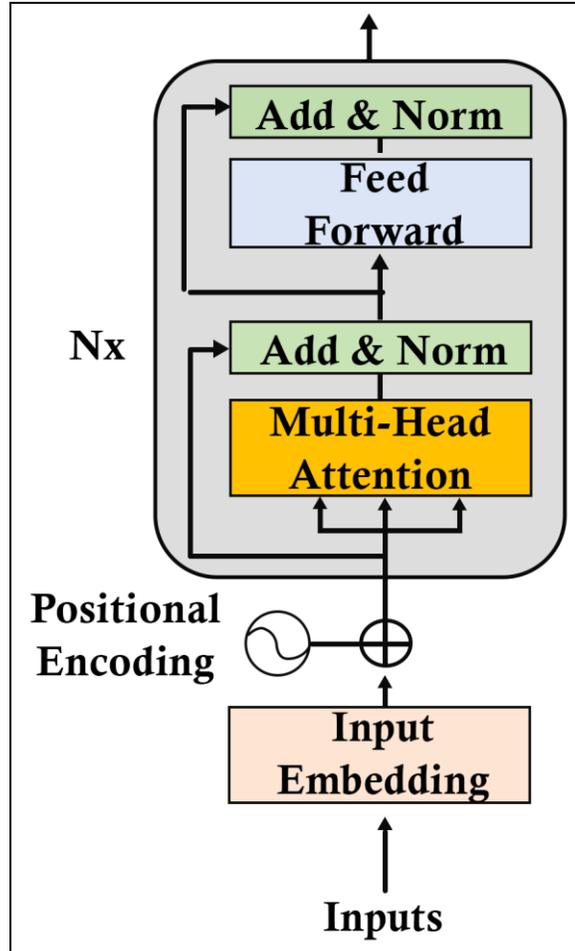
$z_0$	$z_1$	$z_2$	$z_3$	$z_4$	$z_5$	$z_6$	$z_7$
-------	-------	-------	-------	-------	-------	-------	-------

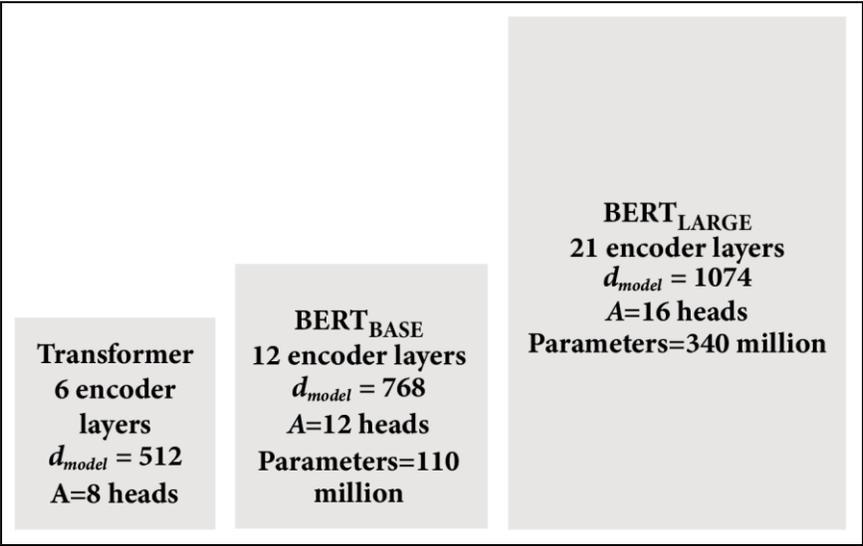




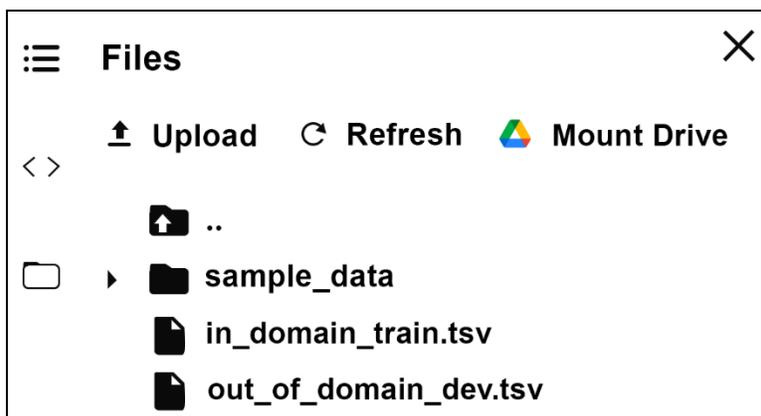
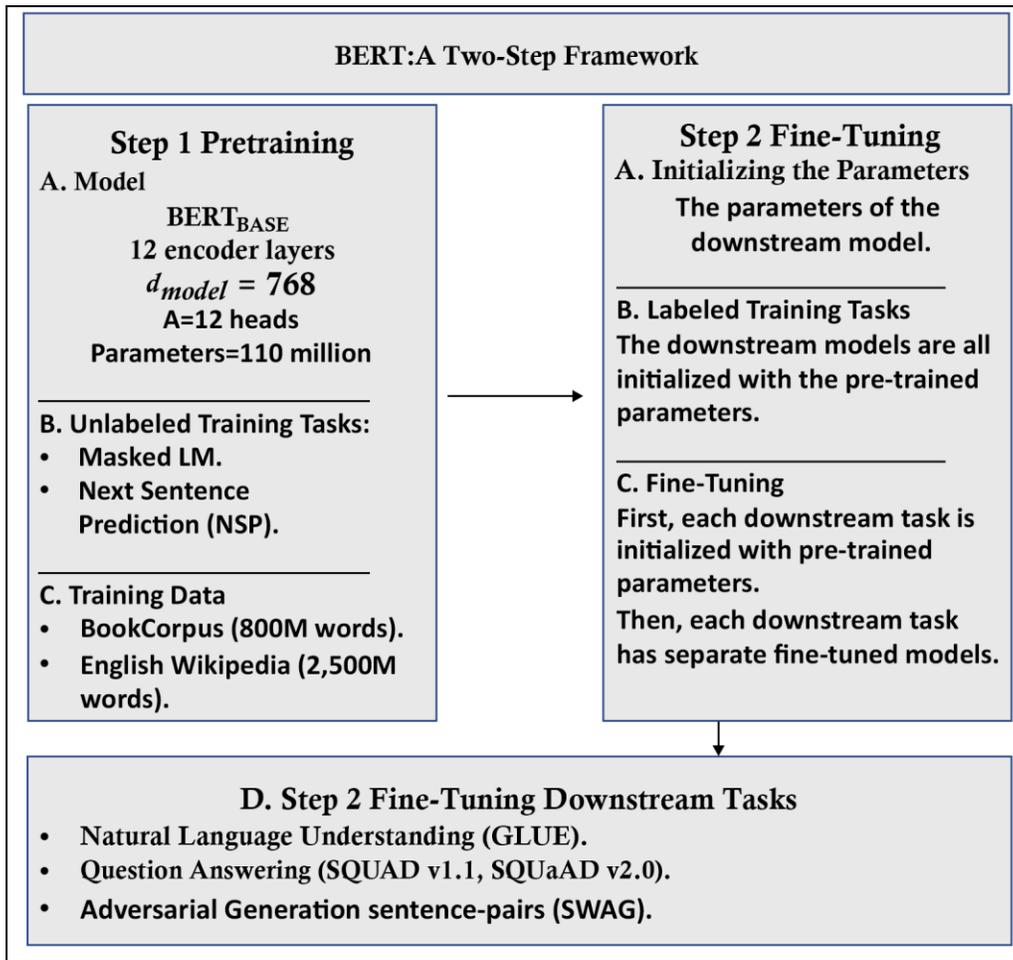


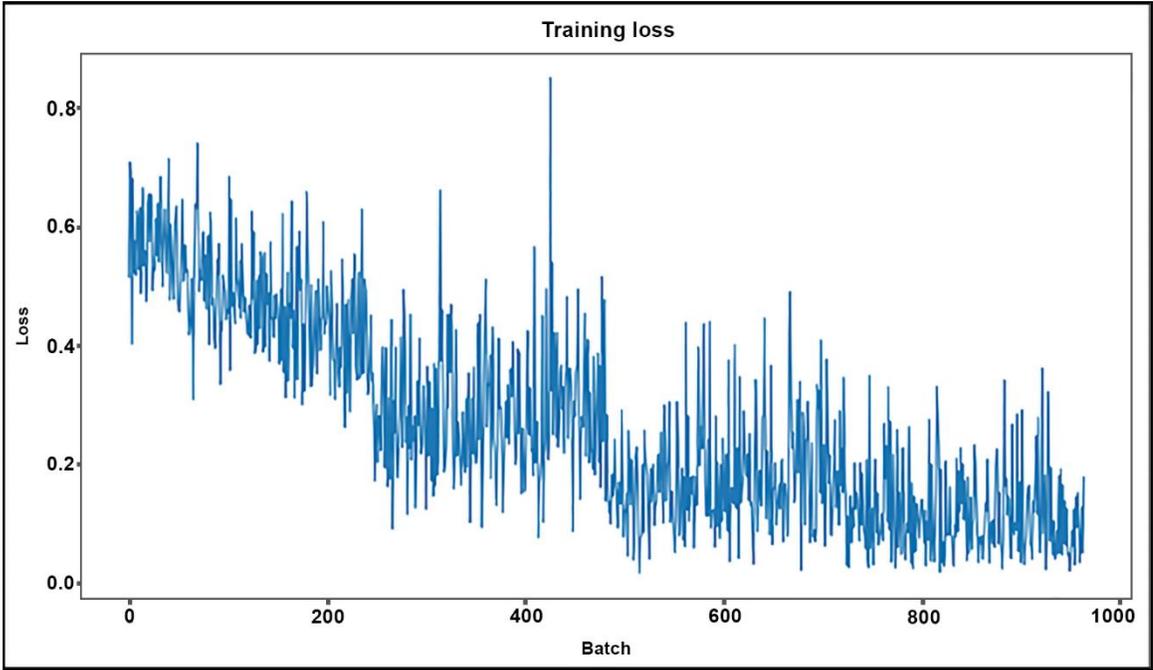
## Chapter 3: Fine-Tuning BERT Models



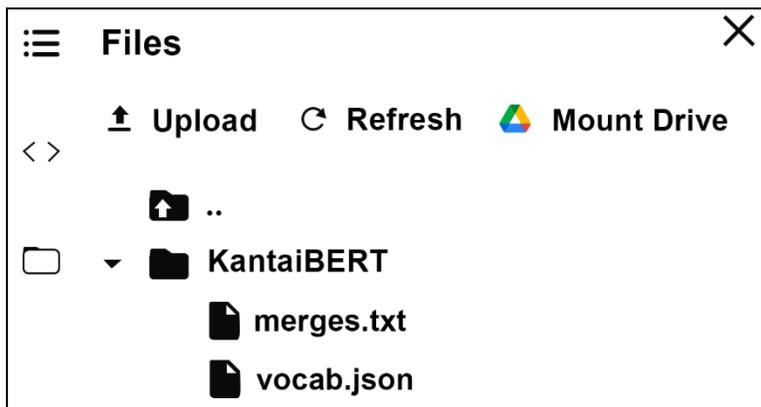
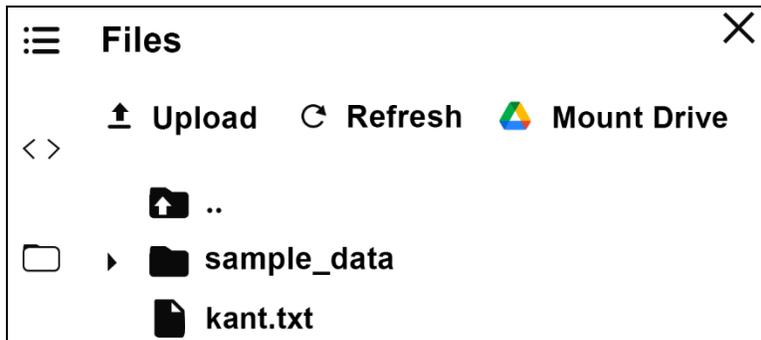


Input	[CLS]	The	cat	slept	on	the	rug	[SEP]	it	likes	sleep	##ing	[SEP]
Token Embeddings	$E_{[CLS]}$	$E_{[The]}$	$E_{[cat]}$	$E_{[slept]}$	$E_{[on]}$	$E_{[the]}$	$E_{[rug]}$	$E_{[SEP]}$	$E_{[it]}$	$E_{[likes]}$	$E_{[sleep]}$	$E_{[##ing]}$	$E_{[SEP]}$
	+	+	+	+	+	+	+	+	+	+	+	+	+
Sentence Embeddings	$E_{[A]}$	$E_{[A]}$	$E_{[A]}$	$E_{[A]}$	$E_{[A]}$	$E_{[A]}$	$E_{[A]}$	$E_{[A]}$	$E_{[B]}$	$E_{[B]}$	$E_{[B]}$	$E_{[B]}$	$E_{[B]}$
	+	+	+	+	+	+	+	+	+	+	+	+	+
Positional encoding	$E_{[0]}$	$E_{[1]}$	$E_{[2]}$	$E_{[3]}$	$E_{[4]}$	$E_{[5]}$	$E_{[6]}$	$E_{[7]}$	$E_{[8]}$	$E_{[9]}$	$E_{[10]}$	$E_{[11]}$	$E_{[12]}$





## Chapter 4: Pretraining a RoBERTa Model from Scratch



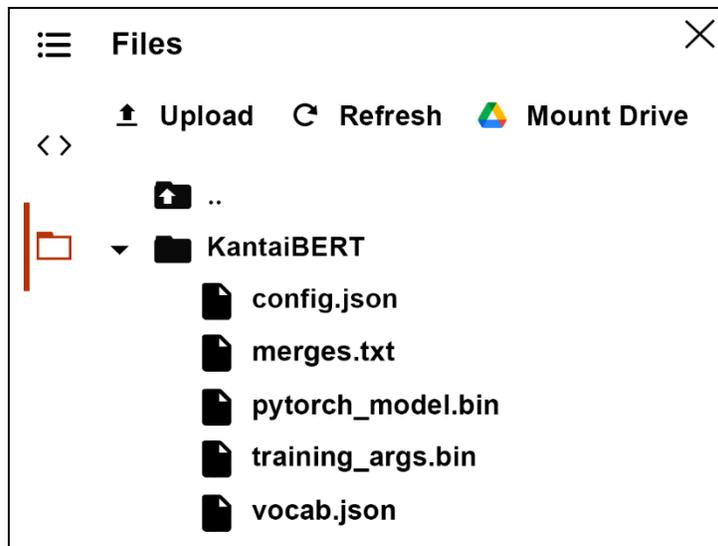
```

+-----+
| NVIDIA-SMI 440.82      Driver Version: 418.67      CUDA Version: 10.1      |
+-----+-----+-----+-----+-----+-----+
| GPU Name      Persistence-M| Bus-Id        Disp.A | Volatile Uncorr. ECC |
| Fan  Temp  Perf  Pwr:Usage/Cap|      Memory-Usage | GPU-Util  Compute M. |
+-----+-----+-----+-----+-----+-----+
|   0  Tesla K80           Off | 00000000:00:04:0  Off |                    0 |
| N/A   49C    PO      63W / 149W |  9707MiB / 11441MiB |             0%      Default |
+-----+-----+-----+-----+-----+-----+
|
| Processes:
| GPU      PID  Type  Process name                               GPU Memory
|                               Usage
+-----+-----+-----+-----+-----+-----+

```

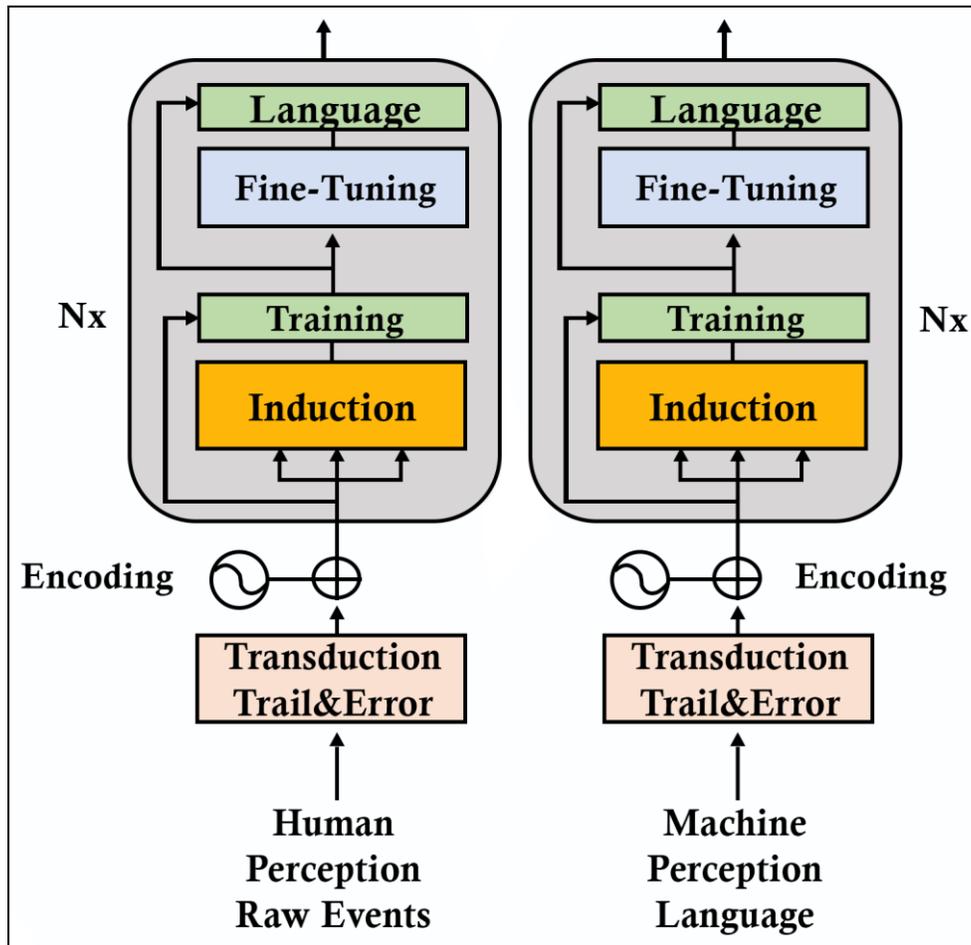
list: LP

[Parameter with shape torch.Size([52000, 768]), Parameter with shape torch.Size([514, 768]), Parameter with shape torch.Size([1, 768]), Parameter with shape torch.Size([768]), Parameter with shape torch.Size([768]), ...] (108 items total)





## Chapter 5: Downstream NLP Tasks with Transformers



Rank	Name	Model	URL	Score
1	Microsoft Alexander v-team	Turing NLR v5		91.2
2	ERNIE Team - Baidu	ERNIE		91.1
3	AliceMind & DURL	StructBERT + CLEVER		91.0
4	liangzhu ge	DeBERTa + CLEVER		90.9
5	DeBERTa Team - Microsoft	DeBERTa / TuringNLR		90.8
6	HFL iFLYTEK	MacALBERT + DKM		90.7
17	GLUE Human Baselines	GLUE Human Baselines		87.1

Rank	Name	Model
1	SuperGLUE Human Baselines	SuperGLUE Human Baselines
<b>+</b>	2 T5 Team - Google	T5
<b>+</b>	3 Huawei Noah's Ark Lab	NEZHA-Plus

Rank	Name	Model	URL	Score
1	Microsoft Alexander v-team	Turing NLR v5		90.9
2	ERNIE Team - Baidu	ERNIE 3.0		90.6
3	Zirui Wang	T5 + UDG, Single Model (Google Brain)		90.4
4	DeBERTa Team - Microsoft	DeBERTa / TuringNLRv4		90.3
5	SuperGLUE Human Baselines	SuperGLUE Human Baselines		89.8

### SuperGLUE Tasks

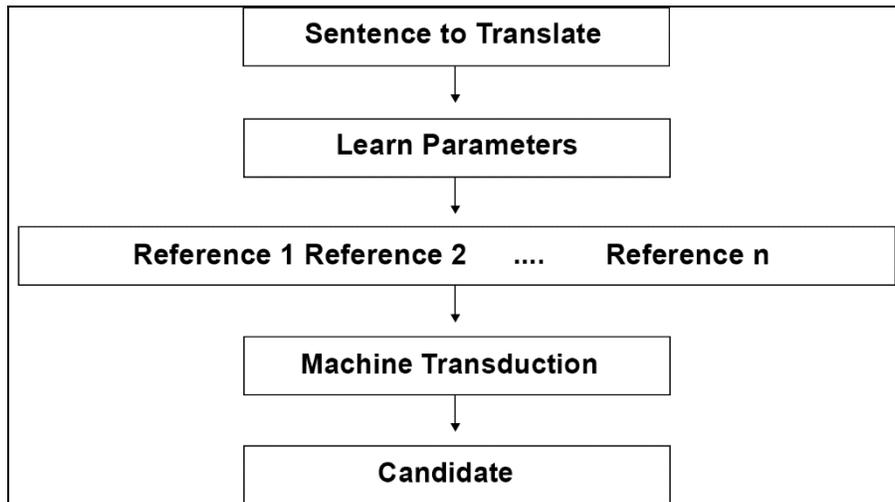
Name	Identifier	Download	More Info	Metric
Broadcoverage Diagnostics	AX-b			Matthew's Corr
CommitmentBank	CB			Avg. F1 / Accuracy
Choice of Plausible Alternatives	COPA			Accuracy
Multi-Sentence Reading Comprehension	MultiRC			F1a / EM
Recognizing Textual Entailment	RTE			Accuracy
Words in Context	WiC			Accuracy
The Winograd Schema Challenge	WSC			Accuracy
BoolQ	BoolQ			Accuracy
Reading Comprehension with Commonsense Reasoning	ReCoRD			F1 / Accuracy
Winogender Schema Diagnostics	AX-g			Gender Parity / Accuracy

DOWNLOAD ALL DATA

Score	BoolQ	CB	COPA	MultiRC	ReCoRD	RTE	WiC	WSC	AX-b	AX-g
89.8	89.0	95.8/98.9	100.0	81.8/51.9	91.7/91.3	93.6	80.0	100.0	76.6	99.3/99.7

Rank	Name	Model	URL	Score	COPA
1	Microsoft Alexander v-team	Turing NLR v5		90.9	98.2
2	ERNIE Team - Baidu	ERNIE 3.0		90.6	97.4
3	Zirui Wang	T5 + UDG, Single Model (Google Brain)		90.4	98.0
4	DeBERTa Team - Microsoft	DeBERTa / TuringNLRv4		90.3	98.4
5	SuperGLUE Human Baselines	SuperGLUE Human Baselines		89.8	100.0

## Chapter 6: Machine Translation with the Transformer

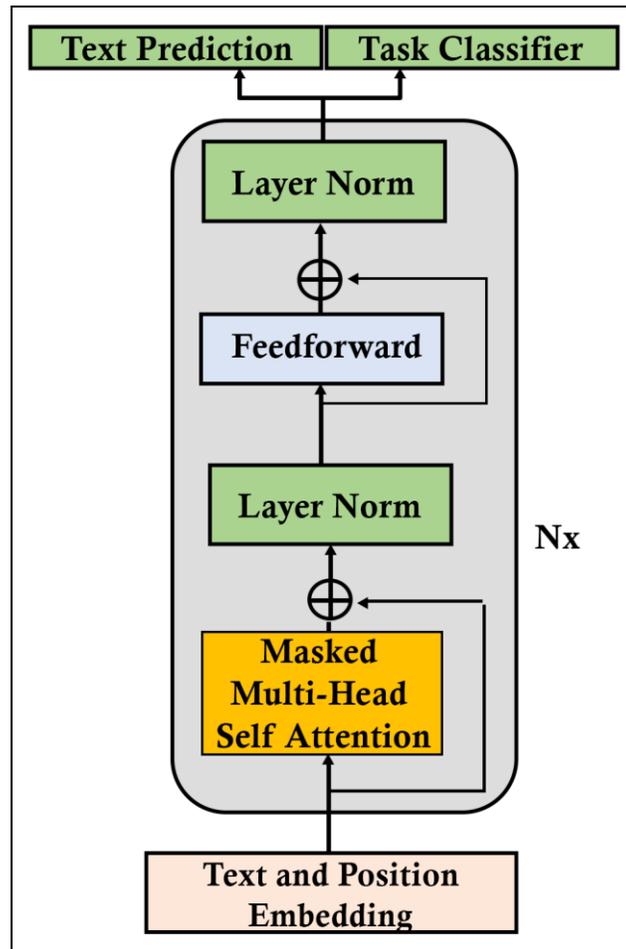


French ↔ English

levez vous svp × please stand up for  
pour cette minute this minute of silence  
de silence



## Chapter 7: The Rise of Suprahuman Transformers with GPT-3 Engines



prompt >>>

prompt >>>



## Grammar correction

Corrects sentences into standard English.



## Grammar correction

Transformation

Generation

Corrects sentences into standard English.

### Prompt

Original: She no went to the market.  
Standard American English:

### Sample response

She didn't go to the market.

[Open in Playground](#)

## API request

```
1 import os
2 import openai
3
4 openai.api_key = os.getenv("OPENAI_API_KEY")
5
6 response = openai.Completion.create(
7     engine="davinci",
8     prompt="Original: She no went to the market.\nStandard
9     temperature=0,
10    max_tokens=60,
11    top_p=1.0,
12    frequency_penalty=0.0,
13    presence_penalty=0.0,
14    stop=["\n"]
15 )
```

**Back to Future:** 🧑 🧒 🚗 🕒

**Batman:** 🦹 🦇

**Transformers:** 🚗 🤖

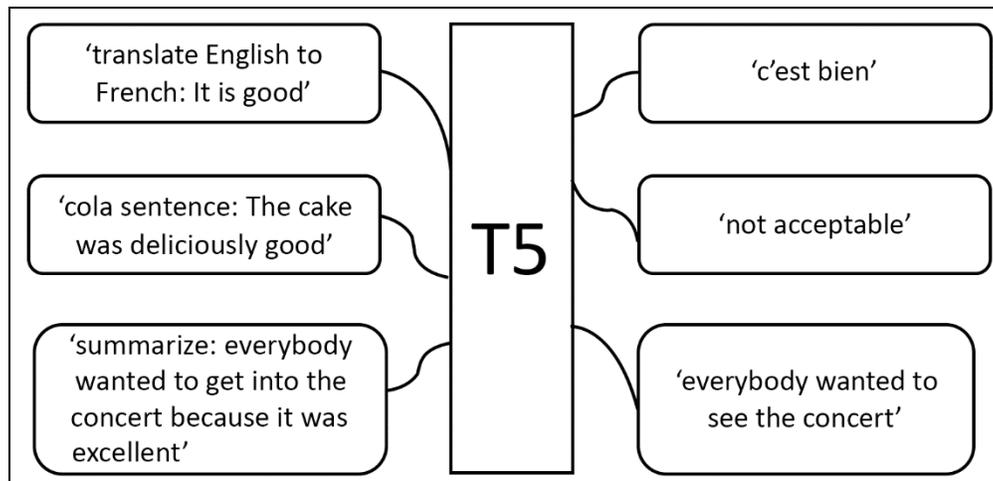
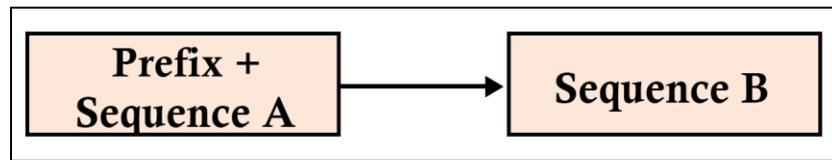
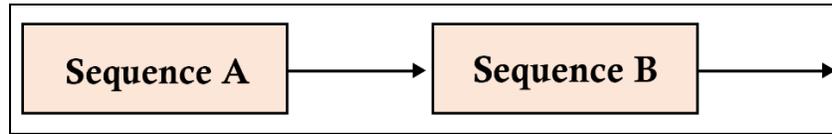
**Mission Impossible:** 🚗 🧑 🏭 🚗

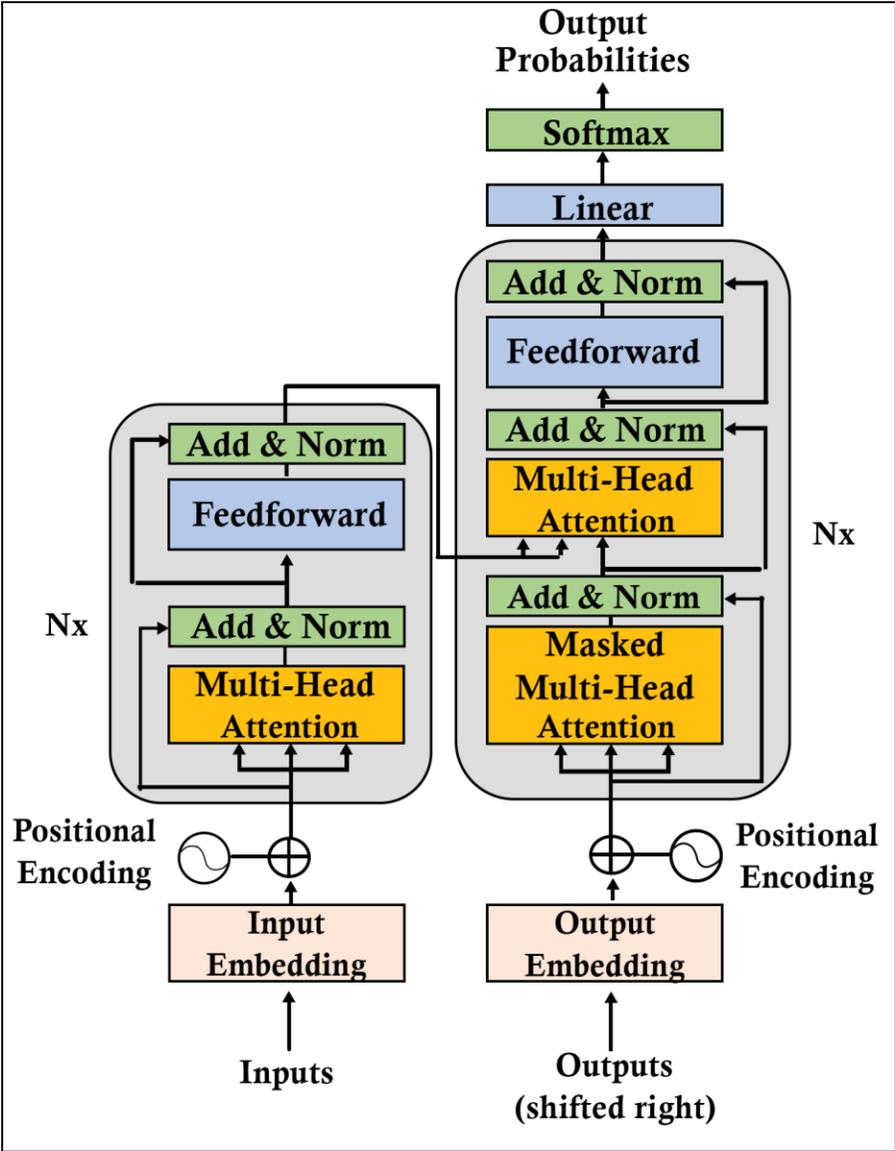
WARNING: The following packages were previously imported in this runtime:  
[pandas]

You must restart the runtime in order to use newly installed versions.

RESTART RUNTIME

## Chapter 8: Applying Transformers to Legal and Financial Documents for AI Text Summarization





 **Hugging Face**

Models 30,682

- distilgpt2**  
 Text Generation • Updated May 21, 2021 • ↓ 20.9M • ♥ 19
- gpt2**  
 Text Generation • Updated May 19, 2021 • ↓ 12.8M • ♥ 59
- bert-base-uncased**  
 Fill-Mask • Updated May 18, 2021 • ↓ 12.2M • ♥ 104

Models 1,978

- t5-small**  
 Translation • Updated Jun 23, 2021 • ↓ 891k • ♥ 5
- t5-base**  
 Translation • Updated Jun 23, 2021 • ↓ 577k • ♥ 31
-  **deep-learning-analytics/wikihow-t5-small**  
 Summarization • Updated Sep 9, 2020 • ↓ 228k
-  **sberbank-ai/ruT5-base**  
 Text2Text Generation • Updated Sep 21, 2021 • ↓ 166k • ♥ 1

### How to use from the 🤗/transformers library

```
from transformers import AutoTokenizer, AutoModelWithLMHead  
  
tokenizer = AutoTokenizer.from_pretrained("t5-large")  
  
model = AutoModelWithLMHead.from_pretrained("t5-large")
```

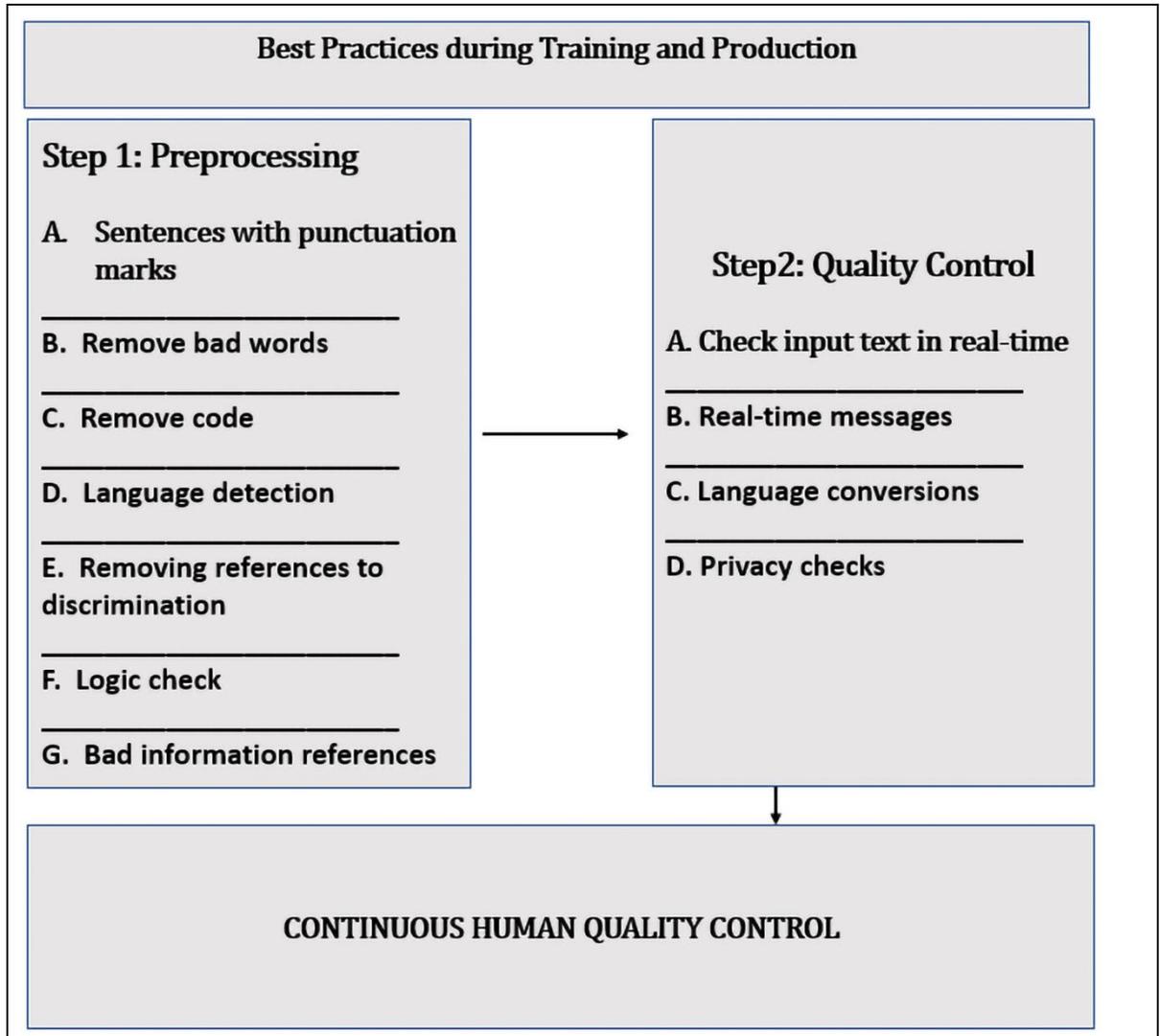
 Copy

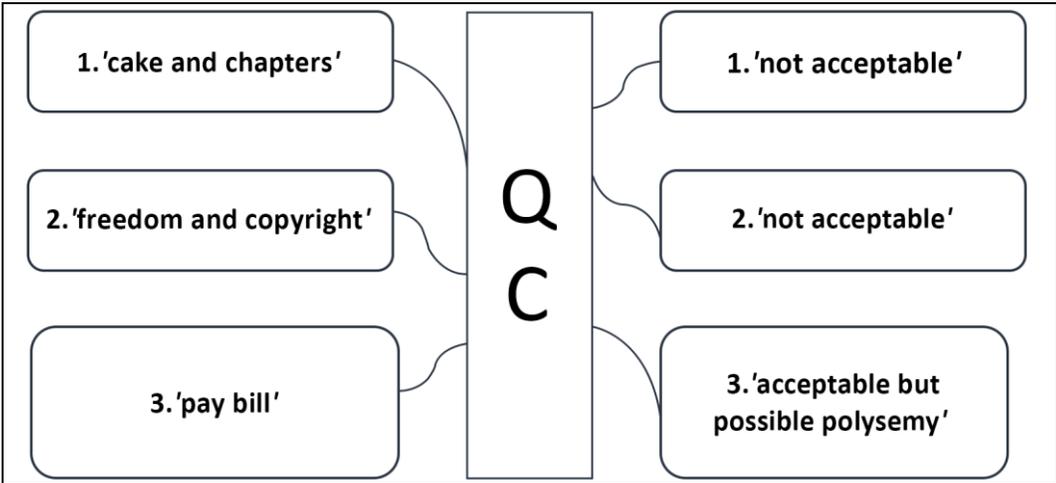
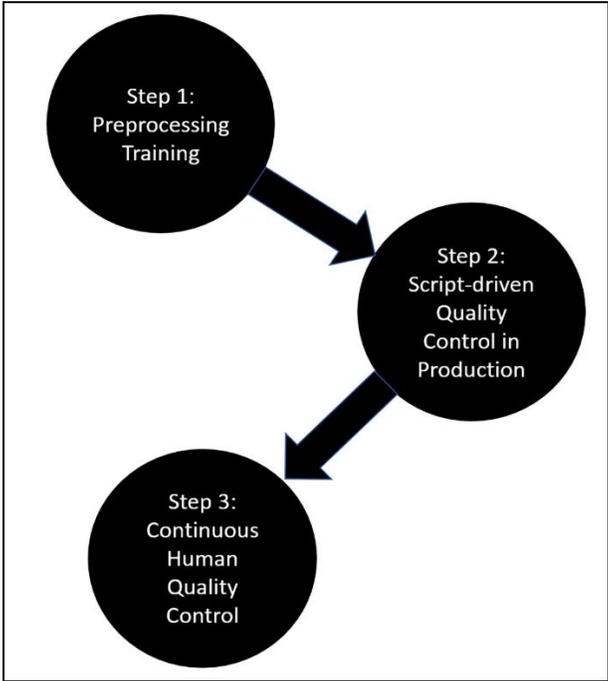


### Summarize for a 2nd grader

Translates difficult text into simpler concepts.

## Chapter 9: Machine Tokenizers and Datasets



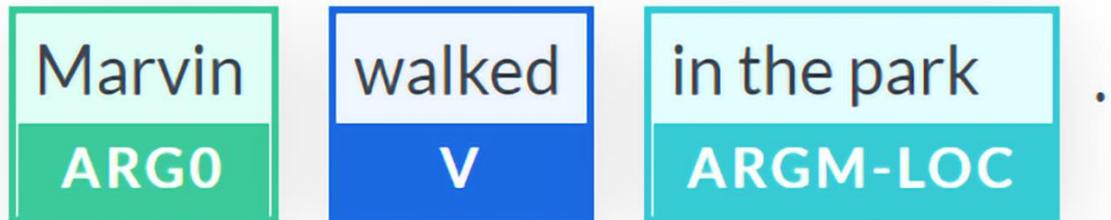


# Playground

**Q: What is the definition of amoeboid?**

## Chapter 10: Semantic Role Labeling with BERT-Based Transformers

Frames for **walked** :



Frames for **Did** :



### Frames for **think** :

Did **Bob** **really** **think**  
ARG0 ARGM-ADV V

**he could prepare a meal for 50 people in only a few hours** ?  
ARG1

### Frames for **could** :

Did Bob really think he **could** **prepare a meal for 50 people in only a few hours** ?  
V ARG1

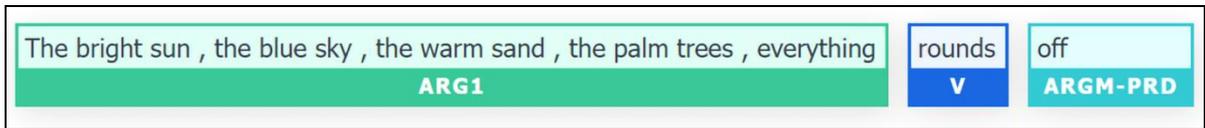
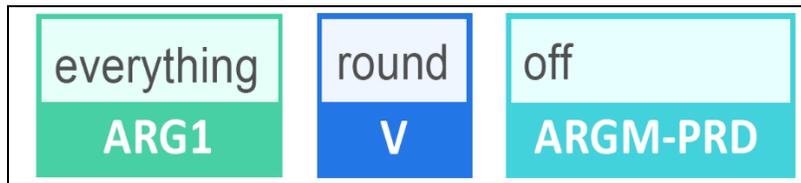
### Frames for **prepare** :

Did Bob really think **he** **could** **prepare** **a meal for 50 people**  
ARG0 ARGM-MOD V ARG1

**in only a few hours** ?  
ARGM-TMP







Sentence

A cup of coffee, please.

Run Model

---

**Model Output**

0 Total Frames

Frames for **maccaked** :

Globydisshing

ARGO

maccaked

V

up

all the tie

ARG1

## Chapter 11: Let Your Data Do the Talking: Story, Questions and Answers

The traffic began to slow down on **Pioneer Boulevard** in **Los Angeles**, making it difficult to get out of the city .

However , **WBGO** was playing some cool jazz , and the weather was cool , making it rather pleasant to be making it out of the city on this Friday afternoon . **Nat King Cole** was singing as **Jo** and **Maria** slowly made their way out of **LA** and drove toward **Barstow** . They planned to get to **Las Vegas** early enough in the evening to have a nice dinner and go see a show .

**Frames for drove :**

The traffic began to slow down on Pioneer Boulevard in Los Angeles ,  
 making it difficult to get out of the city . However , WBGO was playing  
 some cool jazz , and the weather was cool , making it rather pleasant to  
 be making it out of the city on this Friday afternoon . Nat King Cole was  
 singing as Jo and Maria slowly made their way out of LA and  
drove toward Barstow . They planned to get to Las Vegas early

ARGO

ARGM-MNR

V

ARGM-DIR

Original Sequence	Masked tokens		Sample		Prediction
Nat	[MASK]	<b>Generator</b>	Nat	<b>Discriminator ELECTRA</b>	original
King	King		King		original
Cole	Cole		Cole		original
was	was		was		original
singing	[MASK]		driving		<b>replaced</b>

The traffic began

to slow down on Pioneer Boulevard in Los Angeles , making it difficult  
 to get out of the city

ARG1



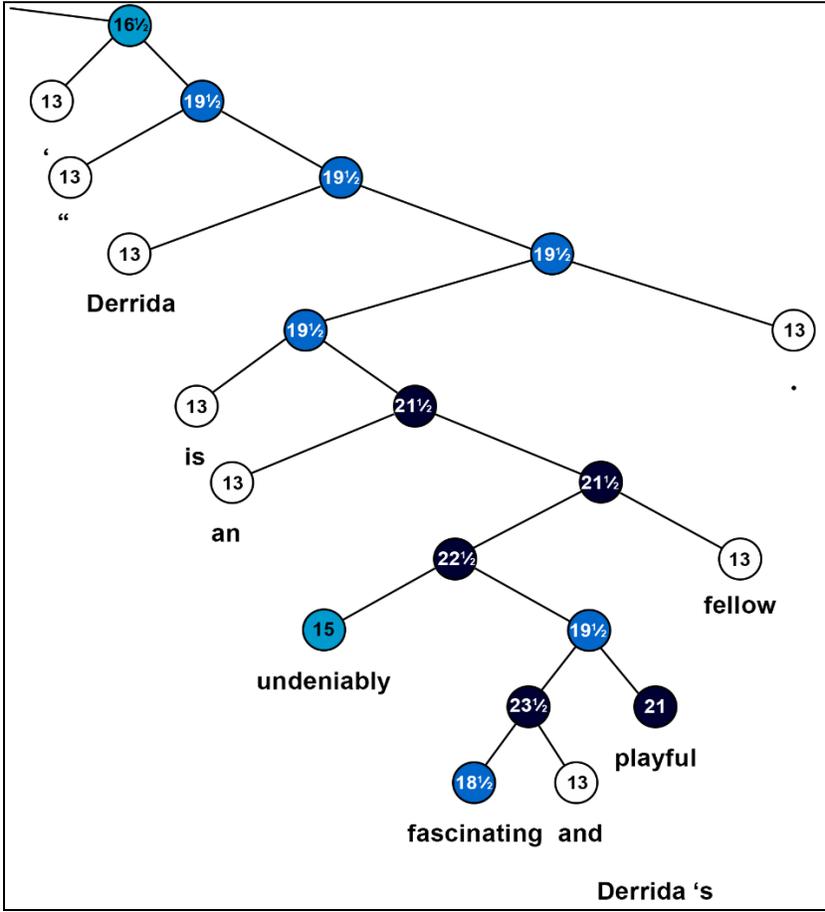
**Frames for playing :**

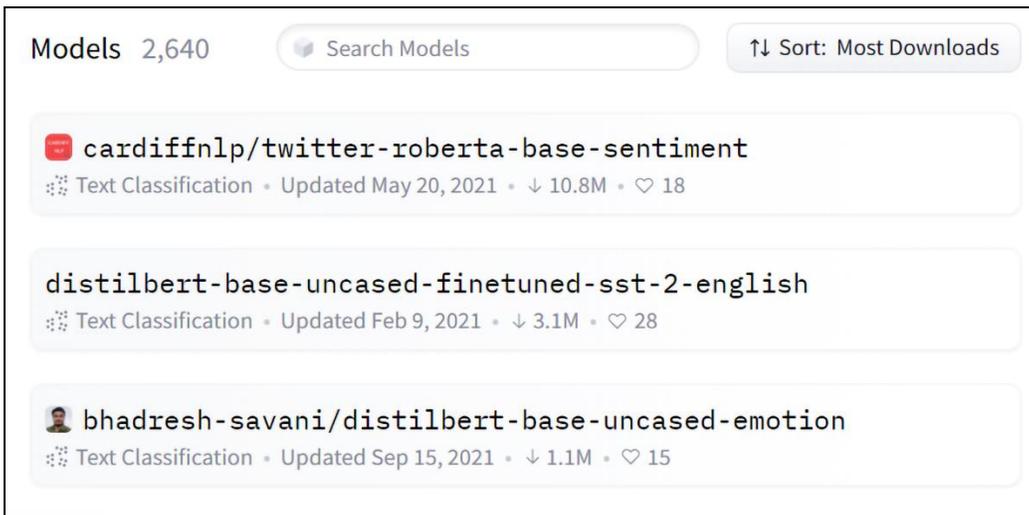
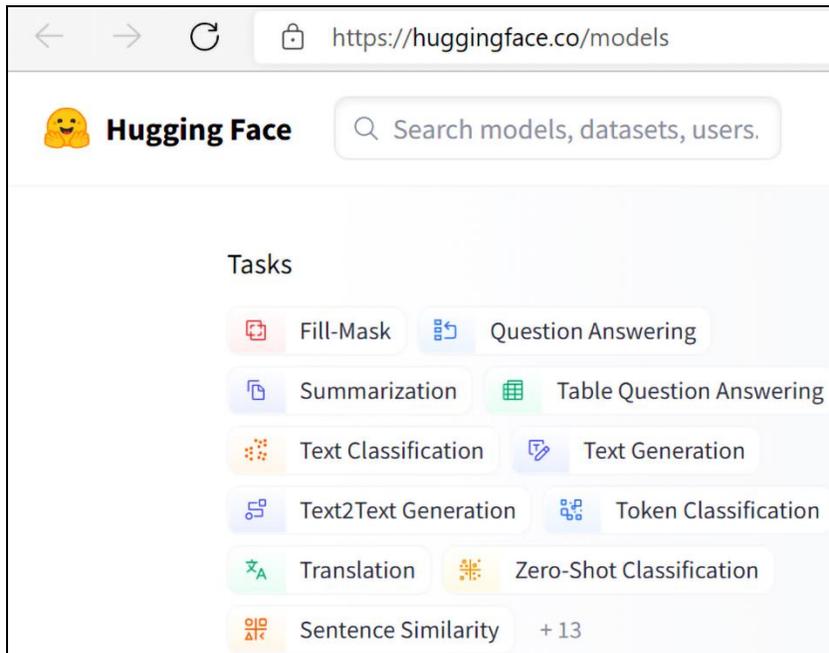
The traffic began to slow down on Pioneer Boulevard in Los Angeles , making it difficult to get out of the city . However ,



The traffic began to slow down on Pioneer Boulevard in <sup>0</sup> Los Angeles , making it difficult to get out of <sup>0</sup> the city . However , WBGO was playing some cool jazz , and the weather was cool , making it rather pleasant to be making it out of <sup>0</sup> the city on this Friday afternoon . Nat King Cole was singing as <sup>1</sup> Jo and Maria slowly made <sup>1</sup> their way out of <sup>0</sup> LA and drove toward Barstow . <sup>1</sup> They planned to get to Las Vegas early enough in the evening to have a nice dinner and go see a show .







## ⚡ Hosted inference API ⓘ

🔗 Text Classification

Examples ▾

Mask token: [MASK]

Though the customer seemed unhappy, she was, in fact satisfied but thinking of something else at the time, which gave a false impression."

Compute

Computation time on cpu: 0.0552 s



## ⚡ Hosted inference API ⓘ

🔗 Text Classification

Examples ▾

Mask token: [MASK]

Though the customer seemed unhappy, she was, in fact satisfied but thinking of something else at the time, which gave a false impression.

Compute

Computation time on cpu: cached



## ⚡ Hosted inference API ⓘ

🔗 Text Classification

Examples ▾

Mask token: <mask>

Though the customer seemed unhappy</s></s> she was, in fact satisfied but thinking of something else at the time, which gave a false impression.

Compute

Computation time on cpu: 0.2568 s

CONTRADICTION	0.003
NEUTRAL	0.996
ENTAILMENT	0.001

## ⚡ Hosted inference API ⓘ

🔗 Text Classification

Examples ▾

Mask token: [MASK]

This model is super cool!

Compute

Computation time on cpu: 0.042 s

1 star	0.004
2 stars	0.003
3 stars	0.017
4 stars	0.145
5 stars	0.831

## ⚡ Hosted inference API ⓘ

🔗 Text Classification

Examples ▾

Mask token: [MASK]

Ce modèle est super bien!

Compute

Computation time on cpu: cached

1 star	0.004
2 stars	0.004
3 stars	0.038
4 stars	0.258
5 stars	0.696

**Frames for** was :

She

**ARG1**

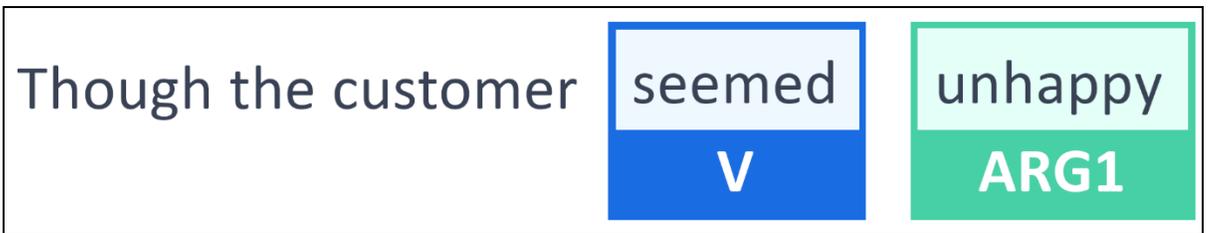
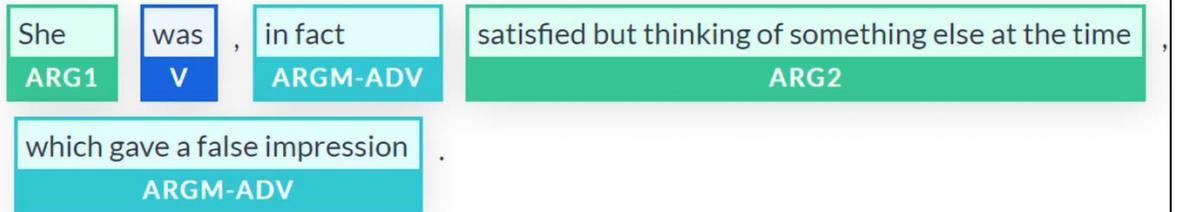
was

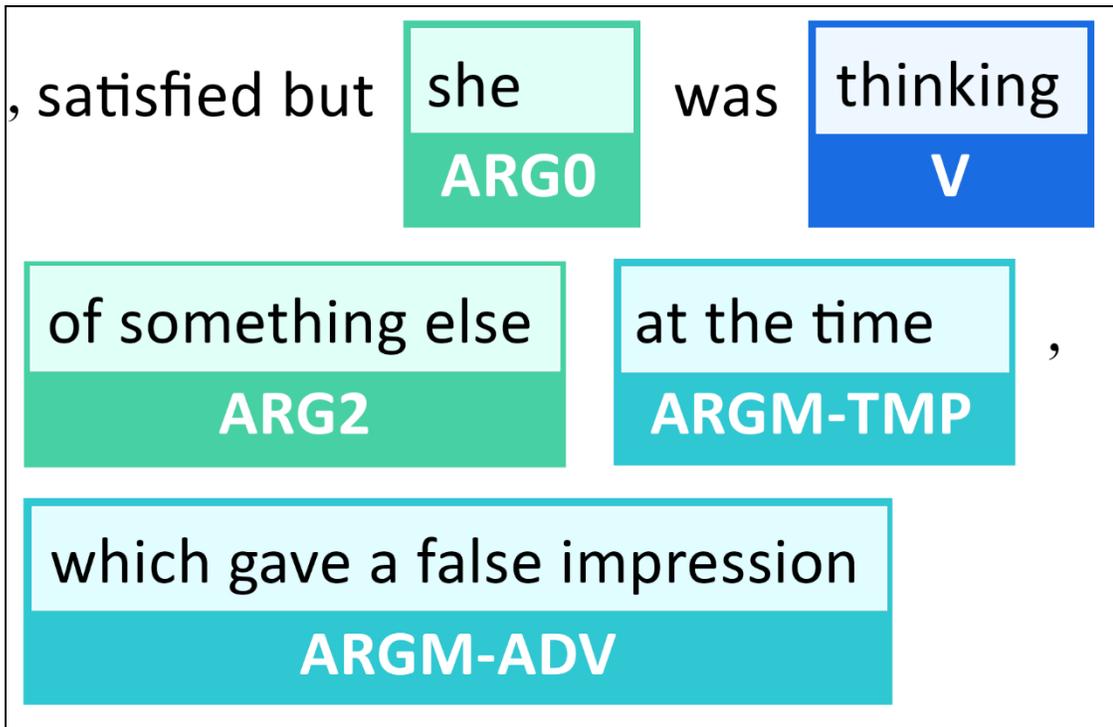
**V**

satisfied

**ARG2**

Frames for **was** :





Though the customer seemed unhappy, she was, in fact, satisfied but she was thinking of something else at the time, which gave a false impression

+

Compute

Computation time on cpu: 0.0552 s

NEGATIVE	0.979
POSITIVE	0.021

## ⚡ Hosted inference API ⓘ

🔗 Text Classification

Examples



Mask token: [MASK]

Though the customer seemed unhappy, she was, in fact, satisfied but thinking of something else at the time, which gave an impression

Compute

Computation time on cpu: 0.03 s

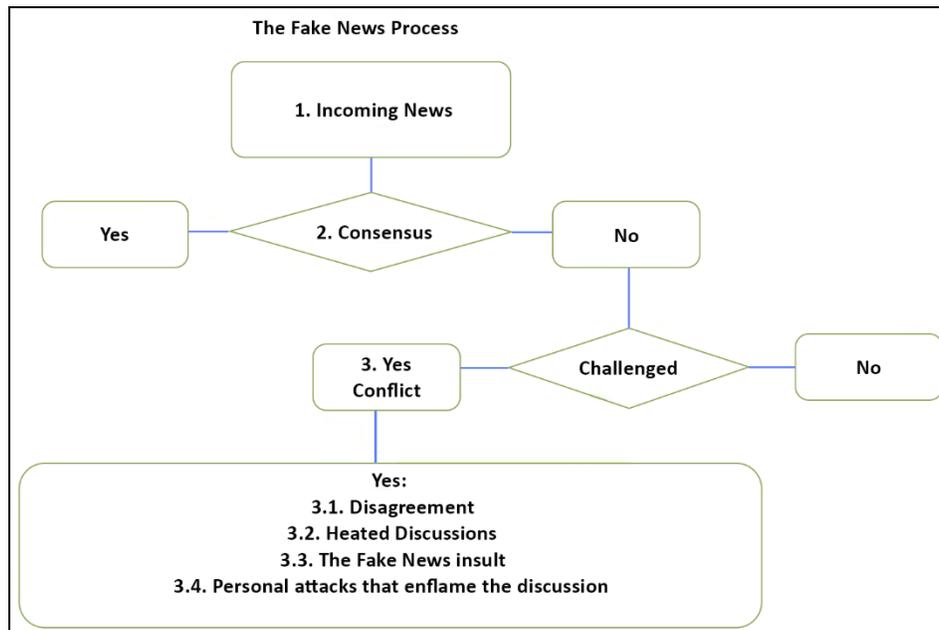
•		
NEGATIVE		0.005
POSITIVE		0.995

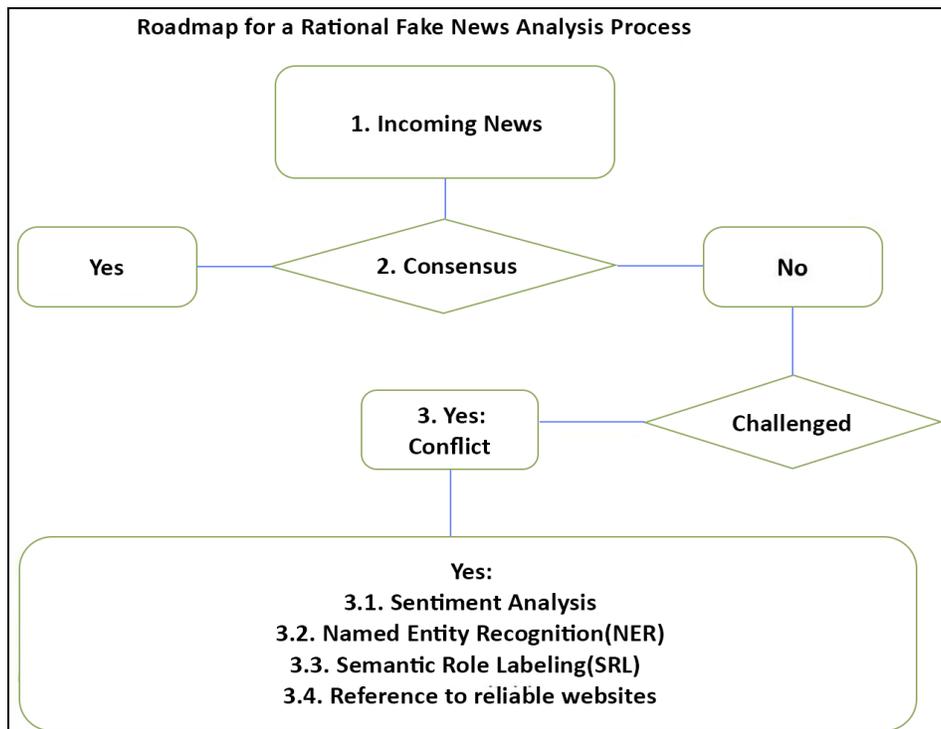
## Chapter 13: Analyzing Fake News with Transformers

<s> Climate Ġchange Ġis Ġbogus . ĠIt ĠâĠ Ġs Ġa Ġplot Ġby Ġthe Ġliberals Ġto Ġtake Ġthe Ġeconomy Ġdown . </s>



Visualizing the top 3 most important words.





<s> | Ġhave Ġhad Ġrifles Ġand Ġguns Ġfor Ġyears Ġand Ġnever Ġhad Ġa Ġproblem . ĠI Ġraised Ġmy Ġkids Ġright Ġso Ġthey Ġhave Ġguns Ġtoo Ġand Ġnever Ġhurt Ġanything Ġexcept Ġrabbits </s>

—————○—————

<s> | Ġhave Ġheard Ġgunshots Ġall Ġmy Ġlife Ġin Ġmy Ġneighborhood , Ġhave Ġlost Ġmany Ġfriends , Ġand Ġam Ġafraid Ġto Ġgo Ġout Ġat Ġnight . </s>

—————○—————

Frames for **had** :

I have had rifles and guns for years and never had a problem . I raised my kids

right so they have guns too and never hurt anything except rabbits .

Frames for **had** :

I have had rifles and guns for years and never had a problem . I raised my

kids right so they have guns too and never hurt anything except rabbits .

## Frames for raised :

I have had rifles and guns for years and never had a

problem. I raised my kids

ARGO

V

ARG1

right

ARGM-DIR

so they have guns too and never hurt anything except rabbits

ARGM-PRP

## Frames for heard :

I have heard gunshots

ARGO

V

ARG1

all my life

ARGM-TMP

in my neighborhood

ARGM-LOC

, have lost

many friends , and am afraid to go out at night .

**Frames for lost :**

I  
**ARG0** have heard gunshots all my life in my  
neighborhood , have lost  
**V** many friends  
**ARG1** , and  
am afraid to go out at night .

[www.amnesty.org](http://www.amnesty.org) > [arms-control](#) ▾ [Traduire cette page](#)

## [Gun violence - key facts | Amnesty International](#)

When people are **afraid of gun** violence, this can also have a negative impact on people's right to ... How **many** people are injured by **gunshots** worldwide? ... We created March For Our Lives because our **friends** who **lost** their lives would have ...

[everytownresearch.org](http://everytownresearch.org) > [impact-gun...](#) ▾ [Traduire cette page](#)

## [The Impact of Gun Violence on Children and Teens ...](#)

29 mai 2019 - They are also harmed when a **friend** or family member is killed with a **gun**, when ... **Gun** homicides, non-fatal **shootings**, and exposure to **gun** violence stunt ... **worried** some or **a lot of** the time that they might get killed or die.<sup>35</sup>.

[www.hsph.harvard.edu](http://www.hsph.harvard.edu) > [magazine](#) ▾ [Traduire cette page](#)

## [Guns & Suicide | Harvard Public Health Magazine | Harvard ...](#)

**Gun** owners and their families are **much** more likely to kill themselves than are ... Zachary may have been **afraid of losing** his commercial driver's license, a great ... In public health lingo, these potentially lifesaving **friends** and colleagues are ... other natural allies such as hunting groups, **shooting** clubs and **gun** rights groups.

[www.pbs.org](http://www.pbs.org) > [extra](#) > [student-voices](#) ▾ [Traduire cette page](#)

## [How teens want to solve America's school shooting problem ...](#)

14 févr. 2019 - It's not having students practice lock-downs out of **fear** that an attack like ... The problem America has is that we give everyone a **gun** without **any** mental health testing. ... After the Florida school **shooting** my **friends** and I were having a ... We can't have more Innocent lives **lost** just because of one person's ...

kidshealth.org > parents > gun-safety ▾ [Traduire cette page](#)

## Gun Safety - Kids Health

But every **year**, **guns** are used to kill or **injure** thousands of Americans. ... Even if you **have** talked to them many times about **gun** safety, they can't truly understand how ... Teens should **never** be able to get to a **gun** and bullets without an adult being there. ... Is there a **gun** or **anything** else dangerous he might get into?

www.healthychildren.org > Pages ▾ [Traduire cette page](#)

## Guns in the Home - HealthyChildren.org

12 juin 2020 - **Did** you know that roughly a third of U S homes with **children have guns**? ... Parents can reduce the chances of **children** being **injured**, however, by ... about pets, allergies, supervision and other safety **issues** before your **child** visits ... Remind your **kids** that if they **ever** come across a **gun**, they must stay away ...

### Frames for hospitalized :

X

ARG1

is a great American , is

hospitalized

V

with coronavirus

ARGM-CAU

, and has requested prayer .

Would you join me in praying for him today , as well

as all those who are suffering from COVID-19 ?

**Frames for requested :**

X is a great American , is hospitalized with  
coronavirus , and has requested prayer .

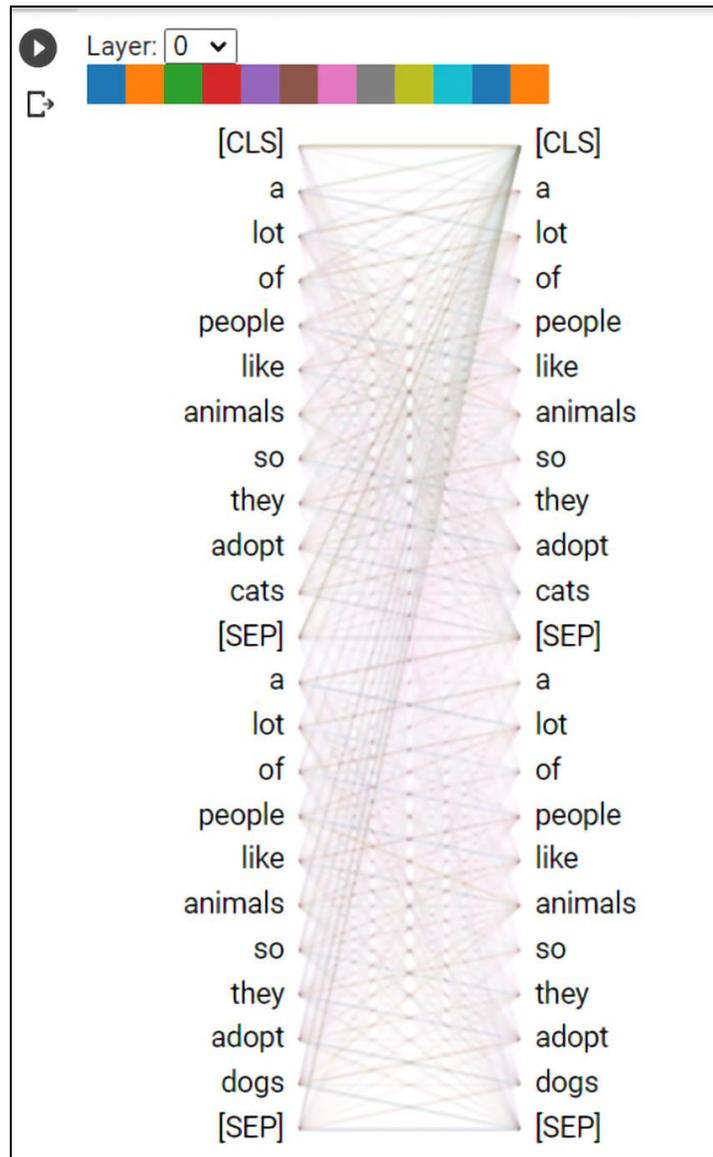
Would you join me in praying for him today , as well  
as all those who are suffering from COVID-19 ?

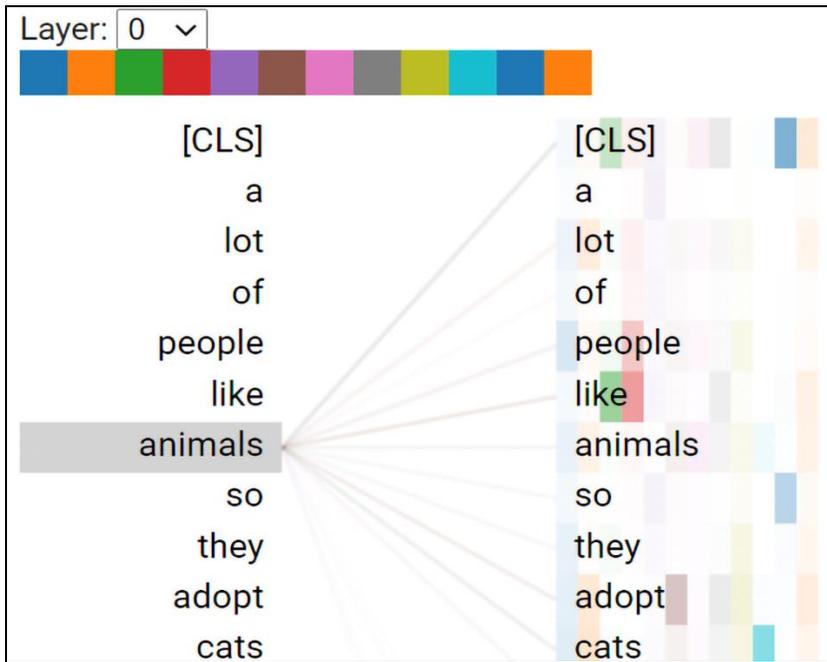
**Frames for dishonoring :**

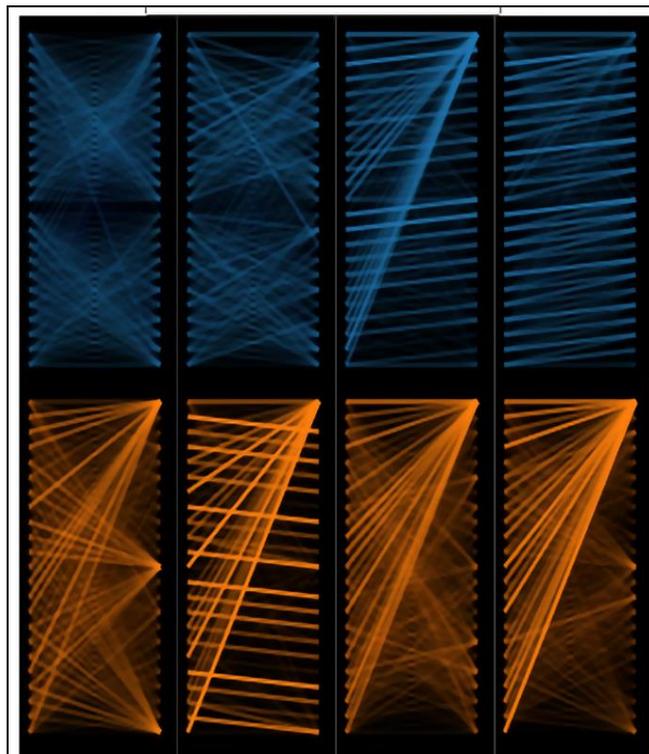
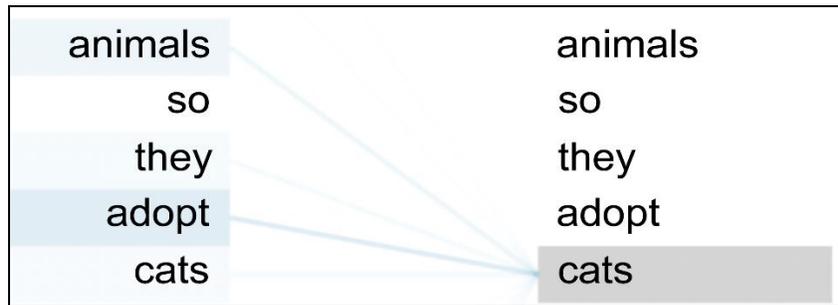
These thugs are dishonoring the memory of X.

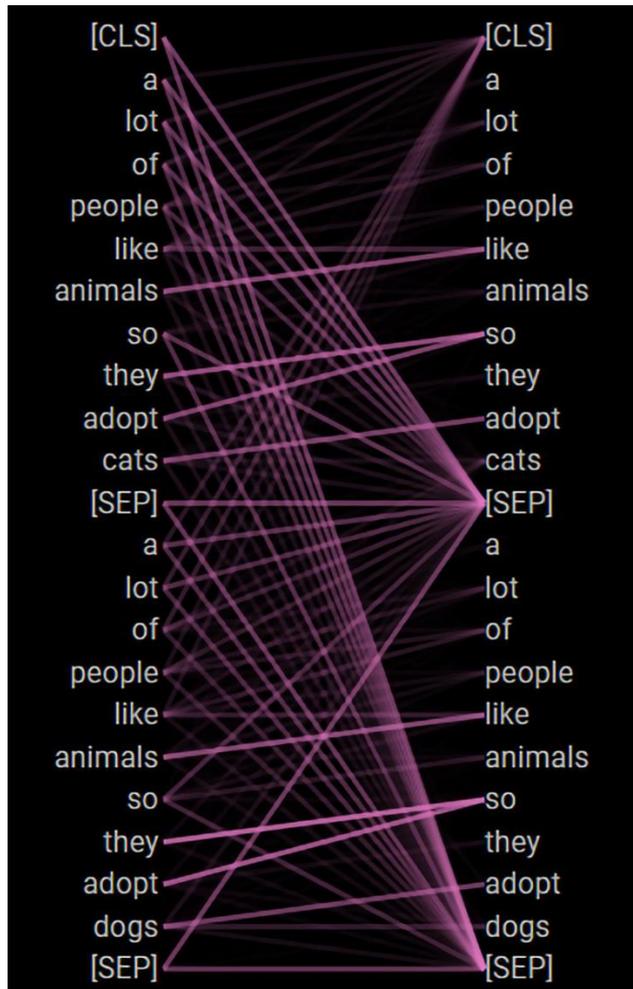


## Chapter 14: Interpreting Black Box Transformer Models









Model: sst2-tiny Dataset: sst\_dev

Projector	PCA	▼
Label by	label	▼

**Data Table**

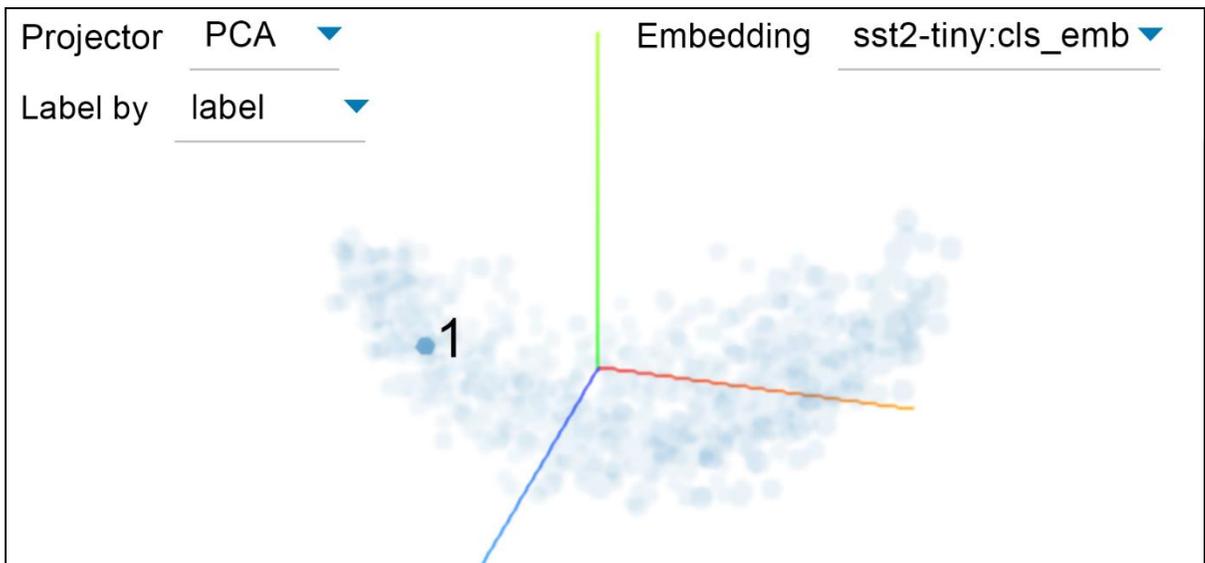
Only show selected    Reset view Select all Columns

index 🔍 ⚙	id 🔍 ⚙	sentence 🔍 ⚙	label 🔍 ⚙
2	4f0e27..	allows us to hope that nolan is poised to embark a major career as a commercial yet inventive filmmaker .	1
3	eb90c4...	the acting ,costumes , music, cinematography and sound are all astounding given the production 's austere locales	1

**Datapoint Editor**

**\*sentence** (TextSegment)

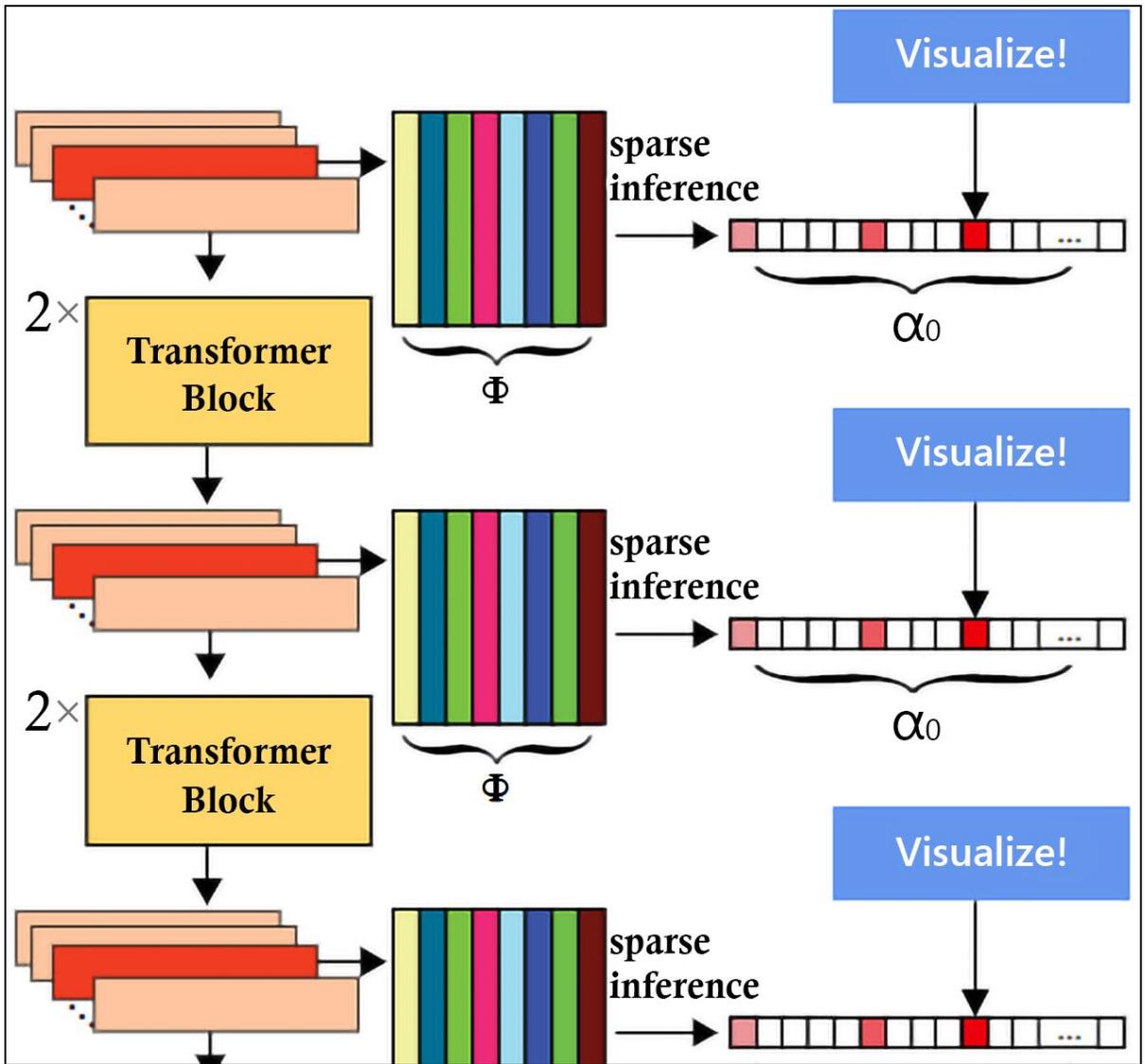
```
allows us to hope that nolan
is poised to embark a major
career as a commercial yet
inventive filmmaker .
```

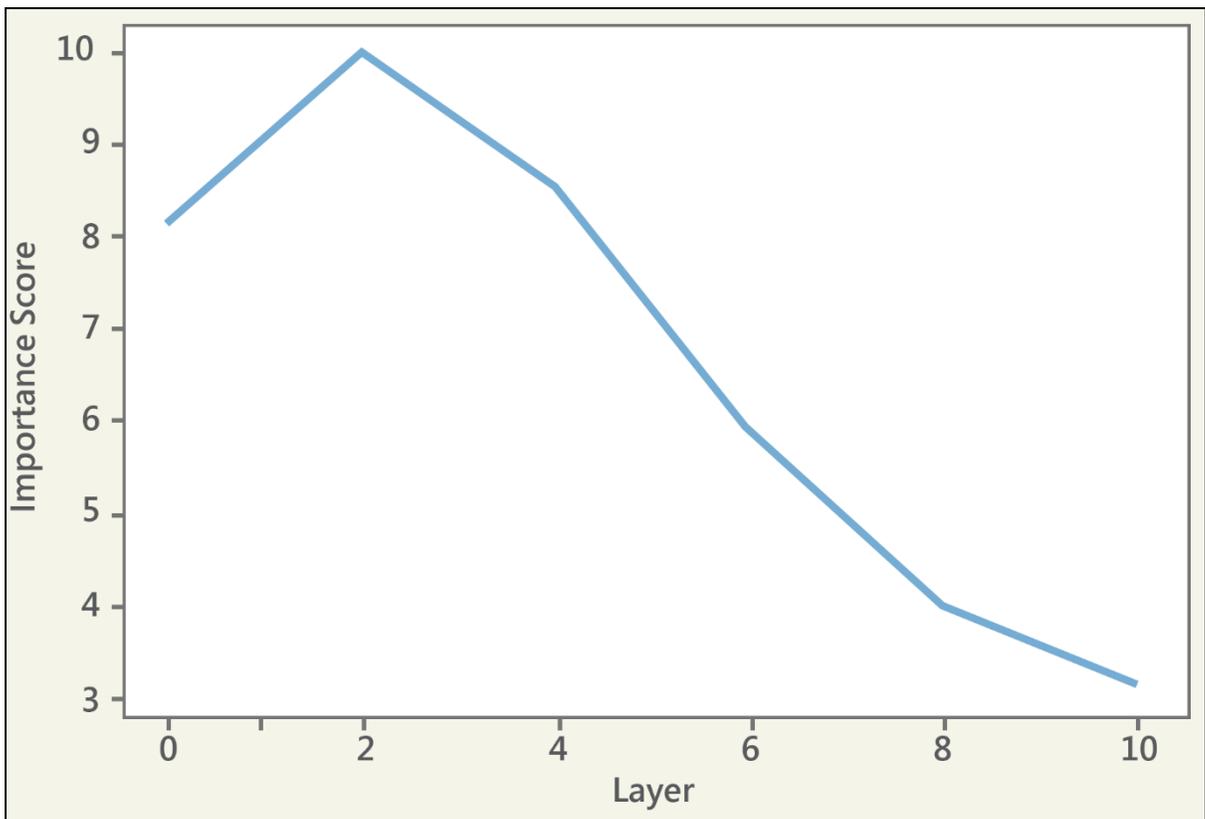


## Visualization

In the following box, input a number  $c$  indicating the transformer factor  $\Phi_{:,c}$  you want to visualize. Then click the button “**Visualize!**” to visualize this transformer factor at a particular layer. For a transformer factor  $\Phi_{:,c}$  and for a layer- $l$ , the visualization is done by listing the 200 word and context with the largest sparse coefficients  $\alpha_c^{(l)}$ 's

← Enter an integer from 0 to 531, indicating the transformer factor you want to visualize.





- music, and while the band initially kept these releases [separate](#), alice in chains' self@-@
- and o. couesi were again regarded as [separate](#) as a result of further work in texas,
- in july 2014, and changed to read" a [separate](#) moh is presented to an individual for each
- without giving it proper structure or establishing it as a [separate](#) doctrine.
- those species, and is now considered to form a [separate](#), monotypic genus – homarinus.
- rp, each npc is typically played by a [separate](#) crew member.
- ," abzug" is presented as a [separate](#) track.

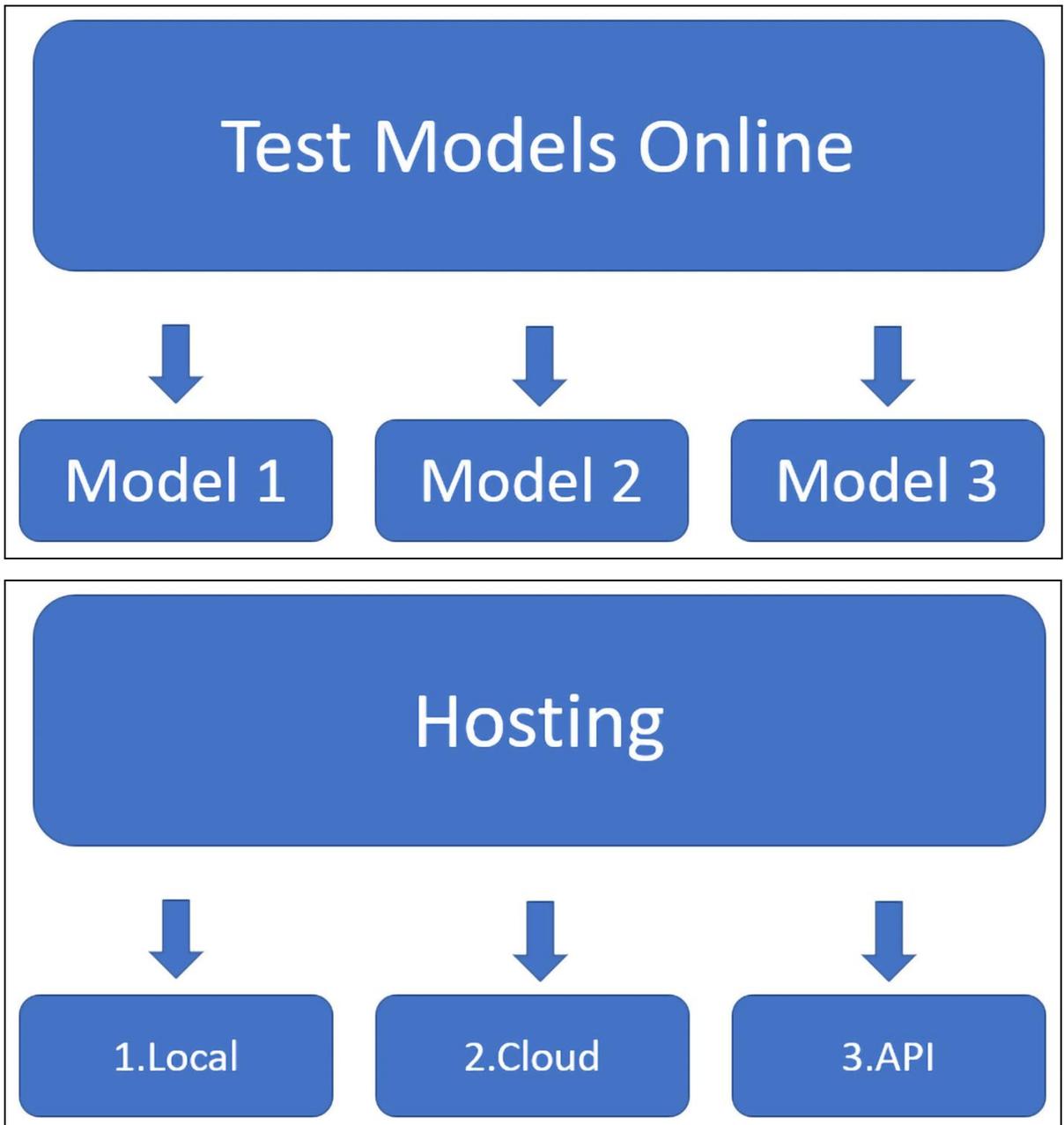
- cigarette smoking; it was not even recognized as a **distinct** disease until 1761.
- the australian freshwater himantura were described as a **separate** species, h. dalyensis, in 2008
- japan, judo and jujutsu were not considered **separate** disciplines at that time.
- though during the episodes, the scenes took place in **separate** parts of the episode.
- triaenops in 1947, retained both as **separate** species; in another review, published in 1982
- ycoperdon< unk>), but **separate** from l. pyriforme.
- although it is a **separate** award, its appearance is identical to its british
- ted upper atmosphere in which the gods dwell, as **distinct** from the

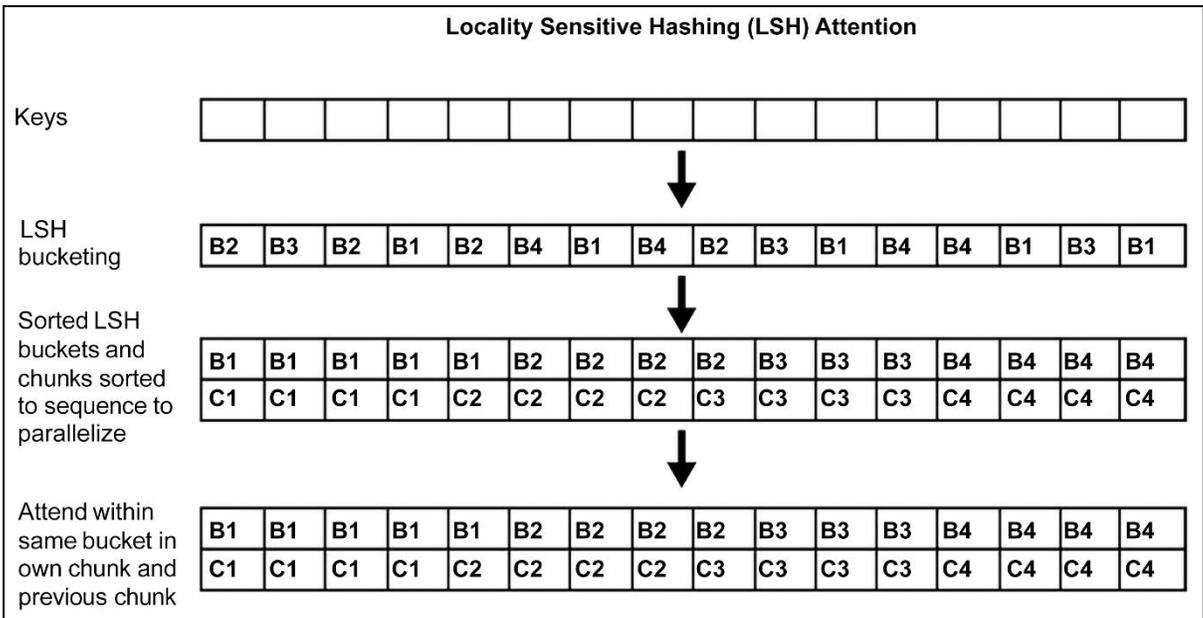
0 1 2 3 4 >> 5  
 The sun rises in the sky

Layer 5

1	2	3	4	5
sky	morning	middle	air	sun
15.89%	4.67%	4.15%	2.95%	2.79%

## Chapter 15: From NLP to Task-Agnostic Transformer Models





### ⚡ Hosted inference API 📘

📄 Text Generation

The student was impoverished and did not know what to do. Compute

Computation time on cpu: 0.6948 s

The student was impoverished and did not know what to do. Nole fixed evident by the salising of his evident. All the inquierwash, forthmees, were growned appearance, Raskolnikov looked sat down, too, and attried boldly at him

Rank	Name	Model
1	ERNIE Team - Baidu	ERNIE 3.0
+	2 Zirui Wang	T5 + Meena, Single Model (Meena Team - Google Brain)
+	3 DeBERTa Team - Microsoft	DeBERTa / TuringNLRv4

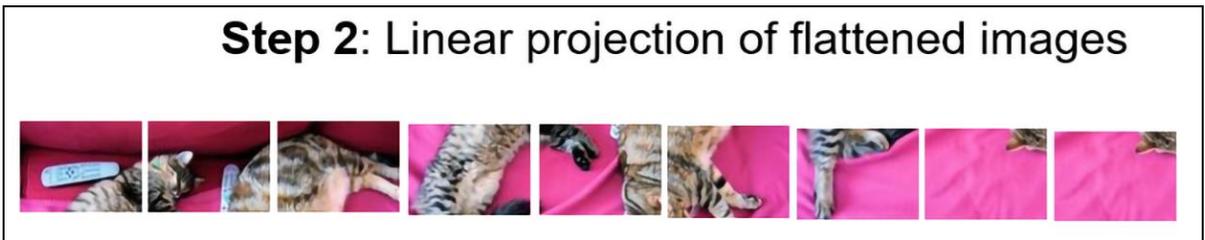
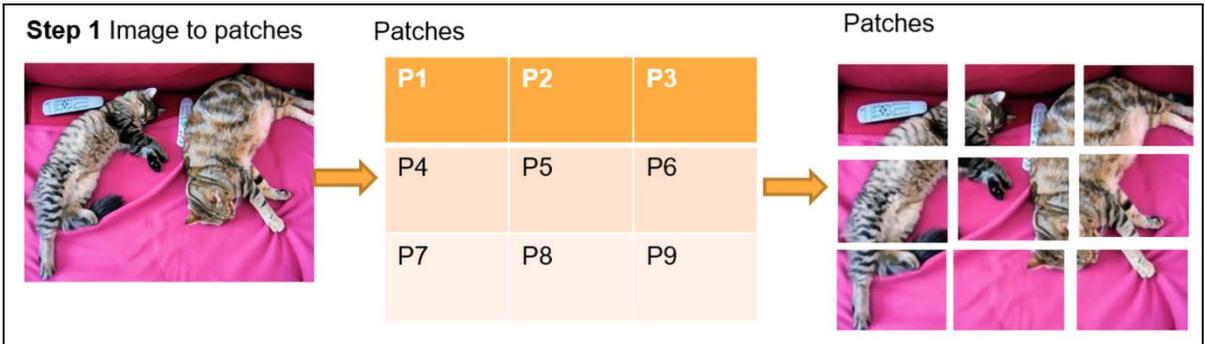
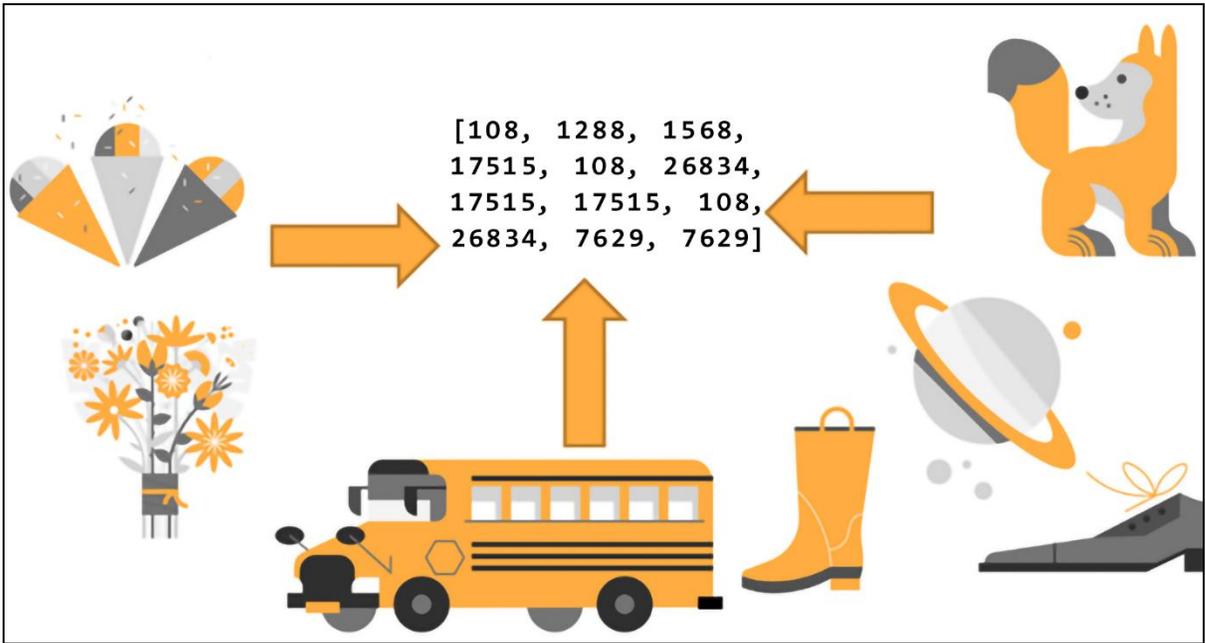
### ⚡ Hosted inference API ⓘ

🏰 Zero-Shot Classification

Last week I upgraded my iOS version and ever since then my phone has been overheating whenever I use your app.

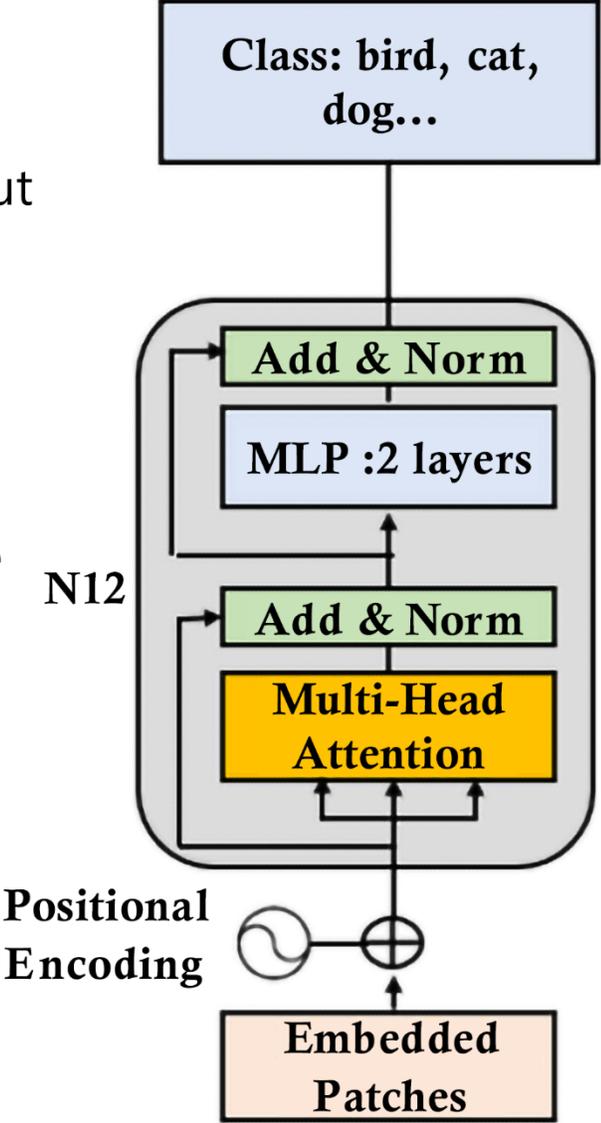
Possible class names (comma-separated)

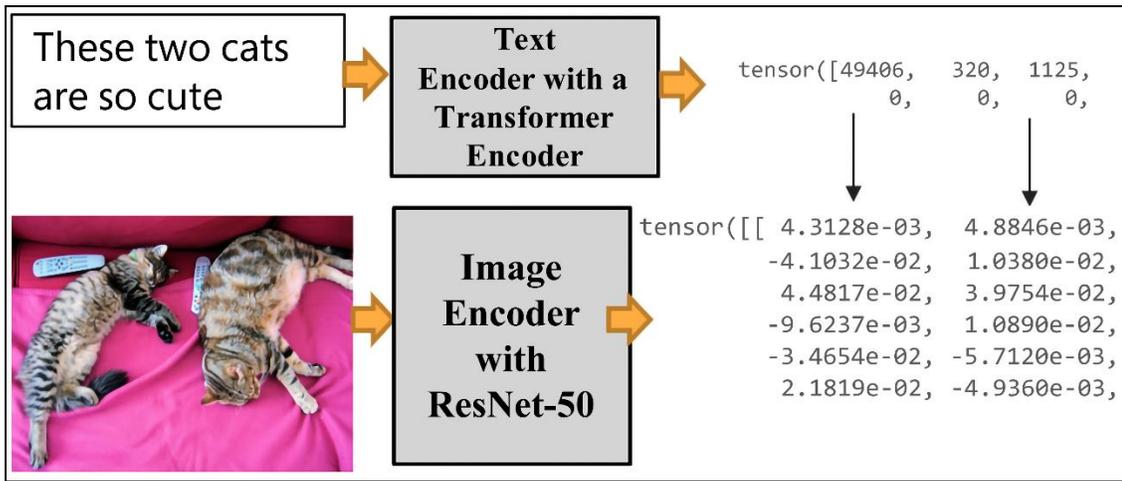
mobile, website, billing, account access



# Transformer Encoder

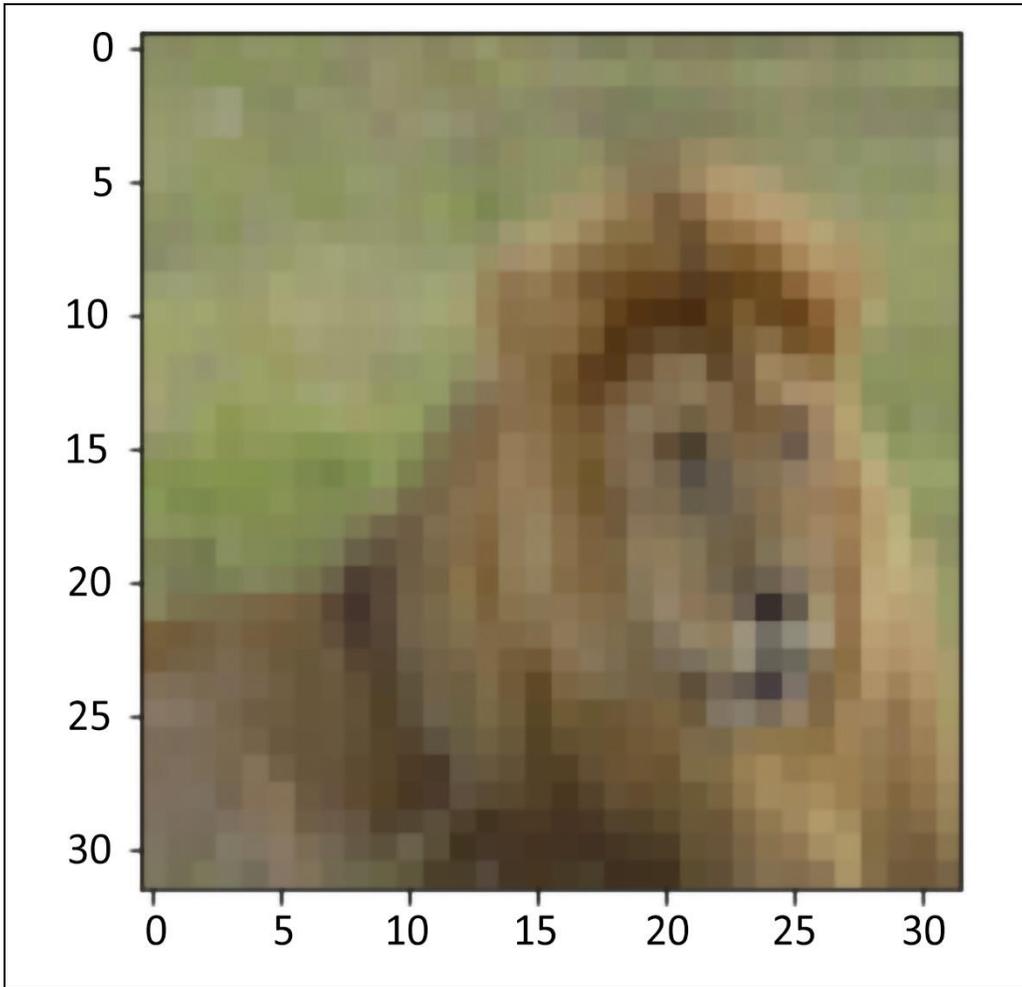
**Step 3:** Hybrid input of embedded patches using a CNN, then a BERT-like encoder model, based on the architecture of the Original Transformer with a multilayer perceptron(MLP)





Select an image index between 0 and 9999

index: 15



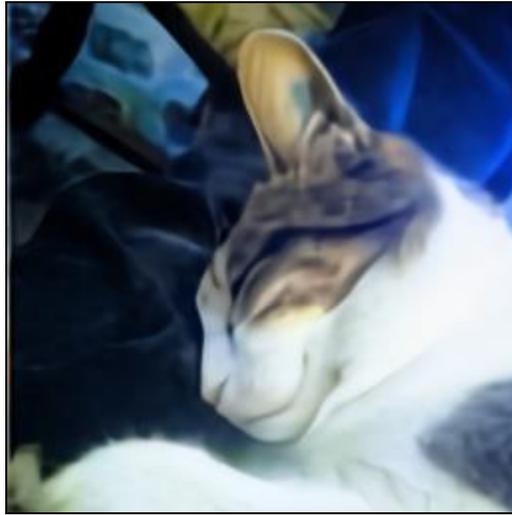
These two cats  
are so cute



**Concatenation in  
a GPT-3  
decoder:  
Up to 256 BPE-  
encoded\*\* text  
tokens  
with 32x32=1024  
image tokens**

```
tensor([[ 1.9134e-02,  
         -4.1632e-04,  
          2.4956e-02,  
         -4.7790e-03,  
         -3.7199e-02,  
          2.4390e-02,  
          1.6557e-02,  
         -2.0359e-02,  
          7.1421e-04,  
          6.6468e-02,  
          2.0003e-02,  
         -1.0968e-02,
```





TEXT PROMPT a photo of alamo square, san francisco, from a street at night

at night

at night

in the afternoon

in the morning

#### AI-GENERATED IMAGES



## Chapter 16: The Emergence of Transformer-Driven Copilots

Convert my shorthand into a first-hand account of the meeting:

We get used to hearing dialogs that only people that know each other well understand. Consider the following dialog between Jane and Tom, two developers, mumbling their way through the day while they are getting down to work in an open space:

Tom: "hi"

Jane: "yeah sure"

Tom: "Coffee?"

Jane: "Nope"

Tom: "Cool. You're trying then."

Jane: "Yup"

Tom: "My wife stopped too a few months ago."

Jane: "Right. She got it."

Tom: "Sleep better?"

Jane: "Yeah. Sure. "

Tom: "I told you. Drinking too much of that

Summary:

Generate



**Summary:**

Tom and Jane are two developers at a company that are getting started for the day. They are both drinking coffee. Tom asks Jane if she wants any coffee or if she has tried giving it up. Jane says she has, and that she is feeling better. Tom's wife also quit coffee and Tom asks if Jane slept|

Generate



260

**Summary:**

Tom asked Jane if she wanted to work on Java and she declined. He asked if she wanted to work on it and she said she would, then he told her that his wife stopped drinking it and said she was sleeping better. Then Jane said she was, too.

**Summary:**

Tom and Jane are two developers that are talking to each other about their day. Jane doesn't drink coffee, but Tom is giving it away for free. Tom's wife also stopped drinking coffee, and is sleeping better. Tom also tells Jane that he told her that she was drinking too much coffee|

Tom: "hi"

Jane: "yeah sure"

Tom: "Want some?"

Jane: "Nope"

Tom: "Cool. You're trying then."

Jane: "Yup"

Tom: "Sleep better?"

Jane: "Yeah. Sure. "

Summary: Tom and Jane are discussing the meeting they had with the team yesterday. Tom is telling Jane that she's in charge of getting the team to try to sleep better, and Jane is telling Tom that she slept well.



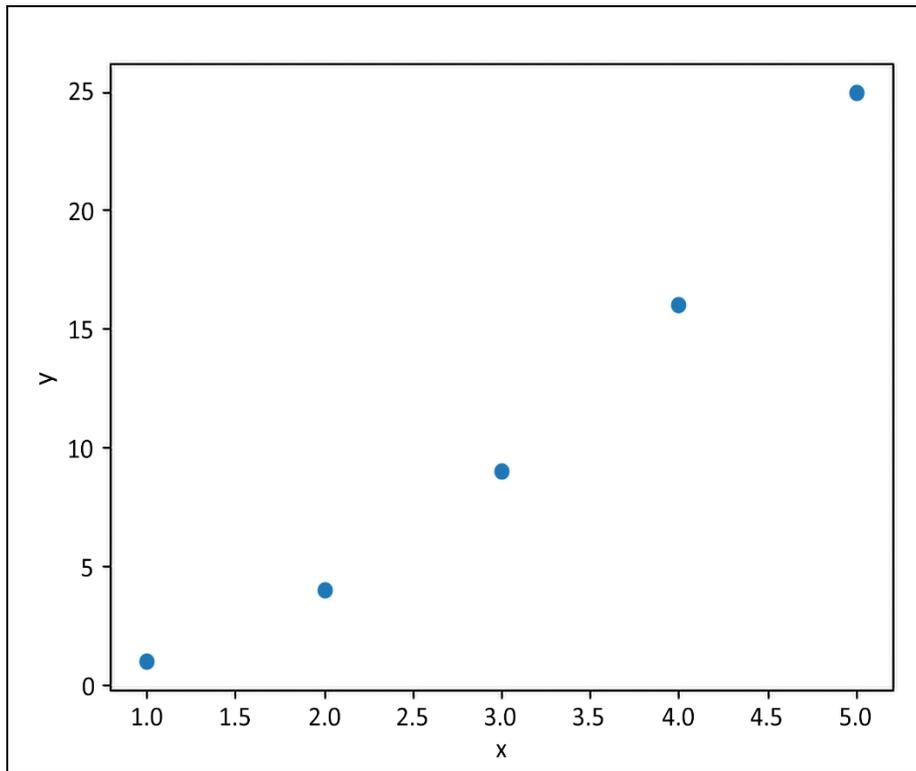
```
def draw_scatterplot(x, y):  
    plt.scatter(x, y)  
    plt.show()
```

Accept solution 2

```
def draw_scatterplot(x, y):  
    plt.scatter(x, y)  
    plt.xlabel('x')  
    plt.ylabel('y')  
    plt.show()
```

Accept solution 3

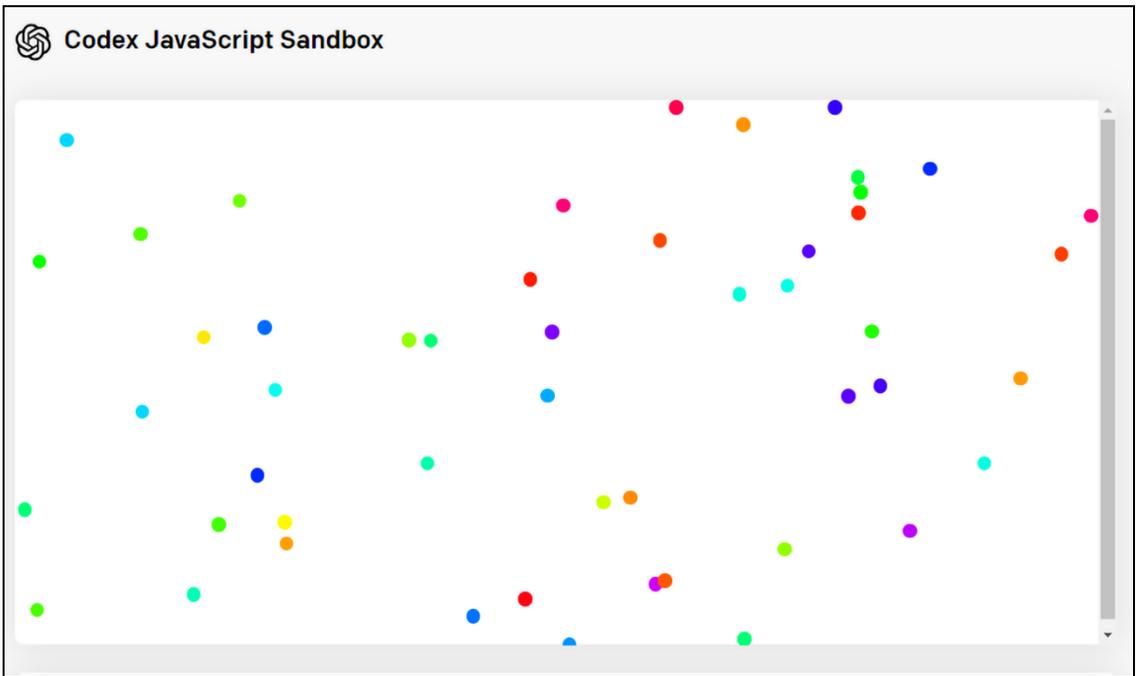
```
def draw_scatterplot(x, y, xlabel, ylabel, title):  
    plt.scatter(x, y)  
    plt.xlabel(xlabel)  
    plt.ylabel(ylabel)  
    plt.title(title)  
    plt.show()
```



## Codex JavaScript Sandbox

Tell Codex what to do below, and it will generate JavaScript that runs here.

Provide instructions...



Export to JSFiddle

Cloud icon | Run | Save | Collaborate | Change | Fiddle listing shows latest version

**Fiddle meta**

Untitled fiddle

No description

Private fiddle **EXTRA**

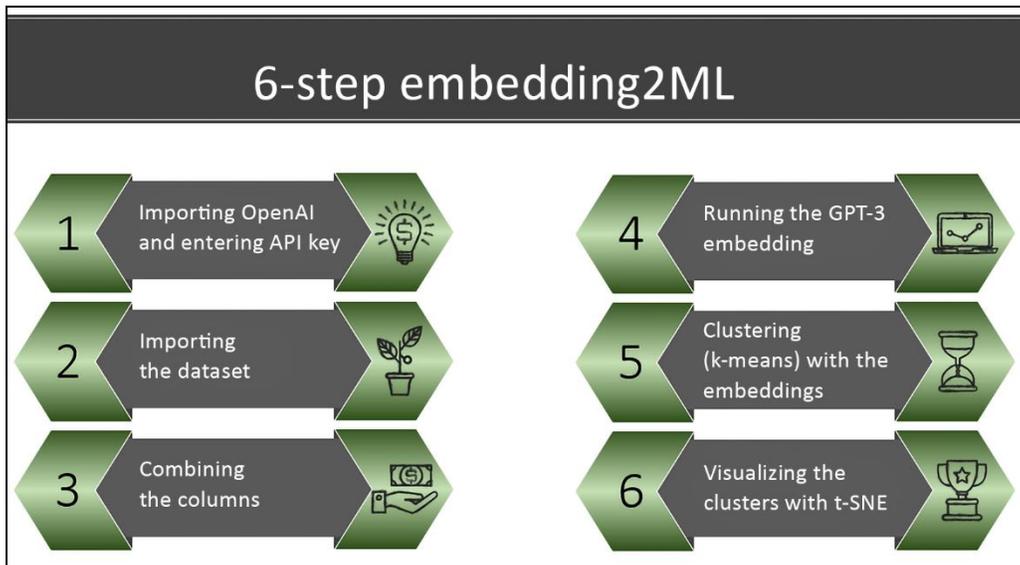
Groups **EXTRA**

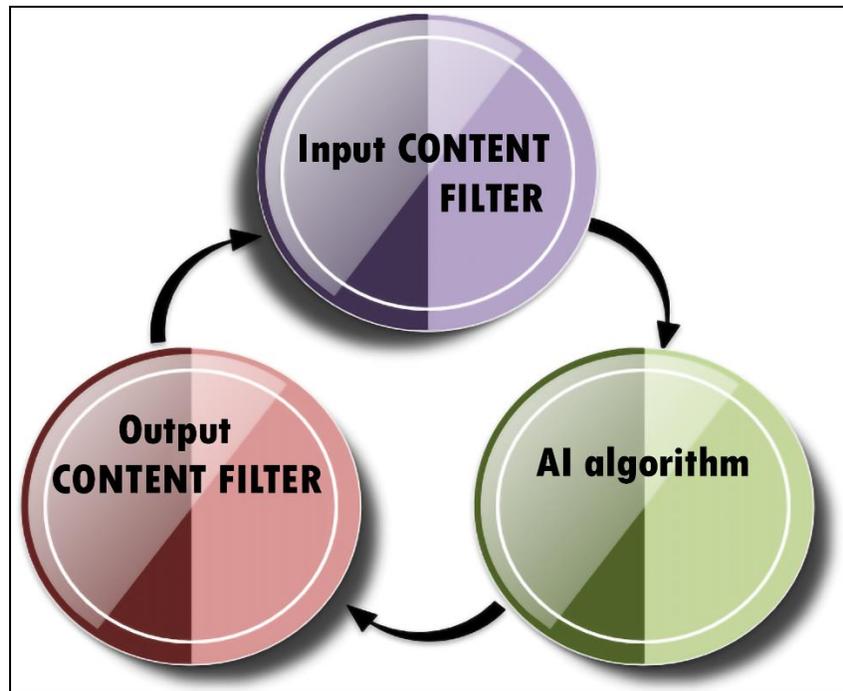
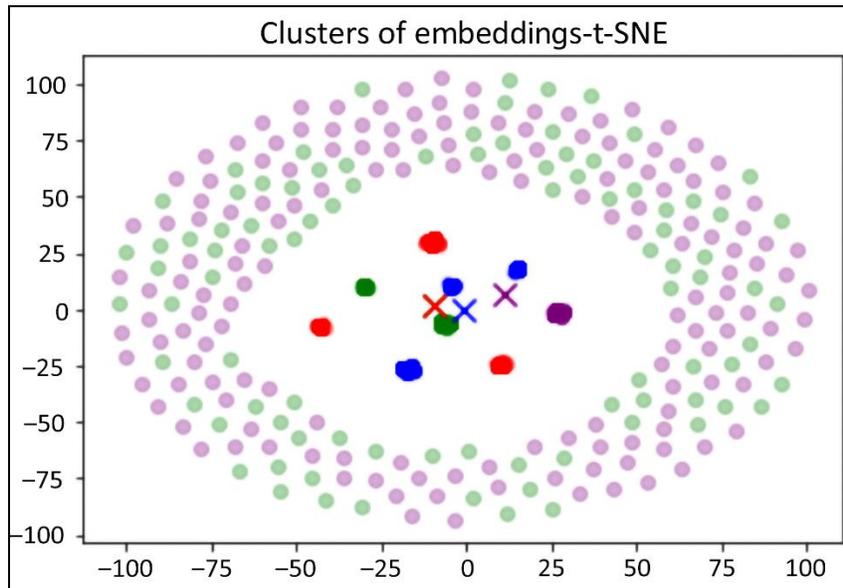
HTML ▾

```
1
2 <html>
3   <head>
4     <script>
5       document.addEventListener
6       ("DOMContentLoaded", function() {
```

JavaScript + No-Library (pure JS) ▾

```
1
```





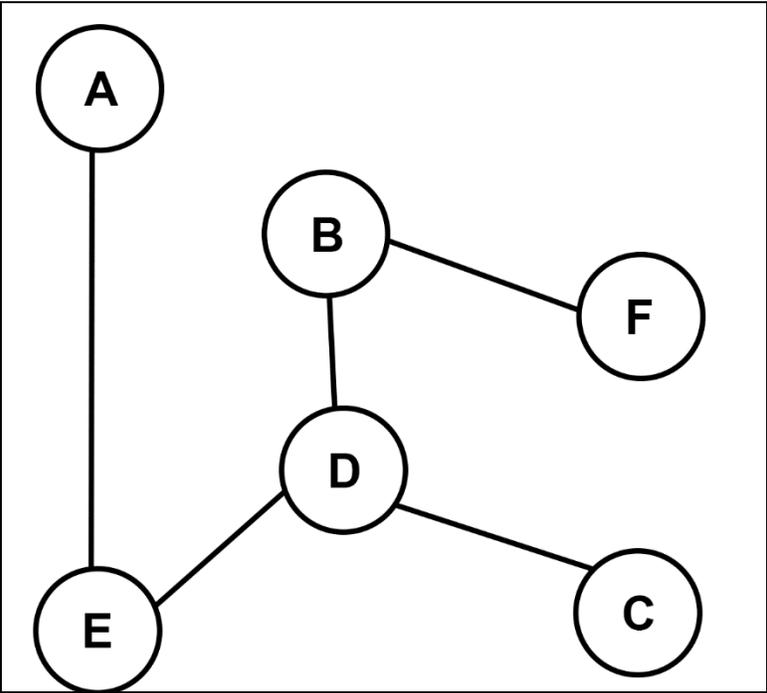




Table of contents



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Version 2.0 (the "License");



Setup



Imports

Load dataset

Load pre-trained

Evaluate

Fine-tune



Inference

horse



airplane



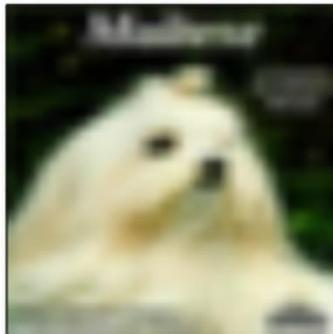
frog



truck



dog



automobile



frog



dog



automobile



dog



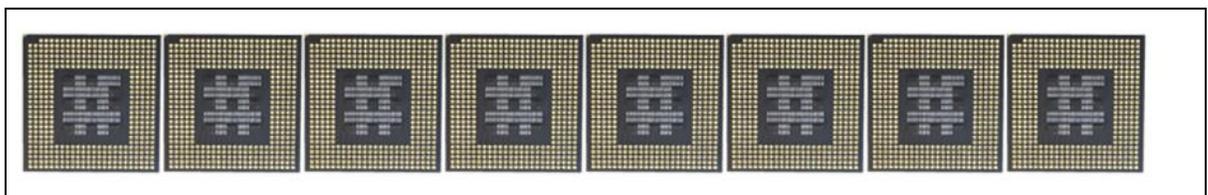
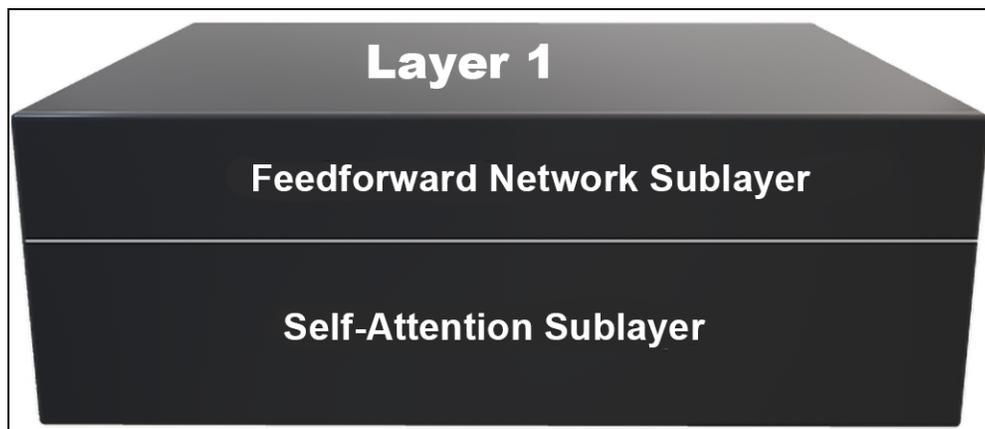
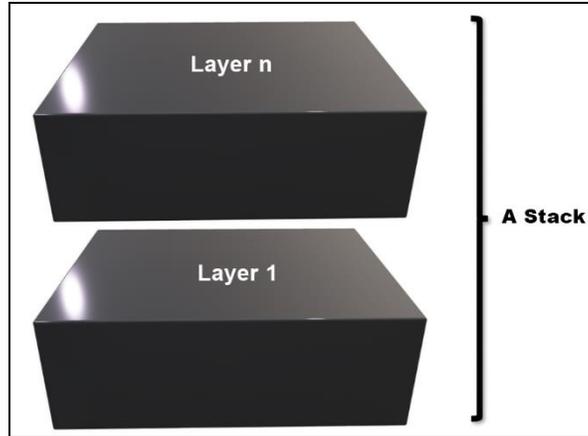
frog



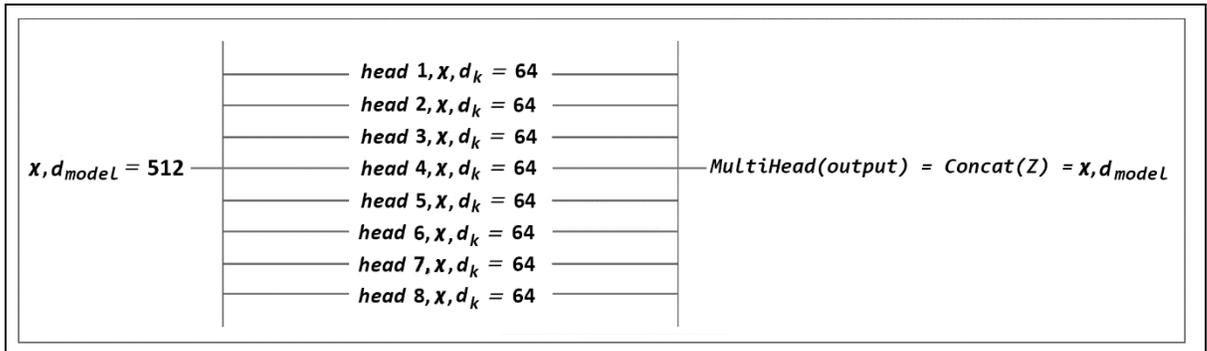
ship



## Appendix I: Terminology of Transformer Models



## Appendix II: Hardware Constraints for Transformer Models



### Notebook settings

Hardware accelerator

None



Omit code cell output when saving this notebook

Cancel

Save

Epoch : 0% | 0/4 [00:00<?, ?it/s]

# Notebook settings

## Hardware accelerator

GPU 

To get the most out of Colab, avoid using a GPU unless you need one. [Learn more](#)

```
+-----+
| NVIDIA-SMI 495.44          Driver Version: 460.32.03    CUDA Version: 11.2     |
+-----+-----+-----+
| GPU  Name           Persistence-M| Bus-Id        Disp.A | Volatile Uncorr. ECC |
| Fan  Temp   Perf    Pwr:Usage/Cap|      Memory-Usage | GPU-Util  Compute M. |
|                                           MIG M.         |
+-----+-----+-----+
|   0   Tesla K80           Off      | 00000000:00:04.0 Off |             0         |
| N/A   39C    P8      27W / 149W |  0MiB / 11441MiB |      0%    Default   |
|                                           N/A              |
+-----+-----+-----+

+-----+
| Processes:                                     |
| GPU  GI  CI           PID   Type   Process name          GPU Memory |
|   ID  ID  ID             |          |                  |      Usage |
+-----+-----+-----+
| No running processes found |
+-----+
```

```

Epoch:  0%|          | 0/4 [00:00<?, ?it/s]Train los
Epoch: 25%|███      | 1/4 [04:58<14:56, 299.00s/it]
Train loss: 0.30048875815208026
Epoch: 50%|██████    | 2/4 [09:58<09:58, 299.42s/it]
Train loss: 0.1783793037950498
Epoch: 75%|██████████  | 3/4 [14:58<04:59, 299.55s/it]
Train loss: 0.11217724044973425
Epoch: 100%|██████████████| 4/4 [19:58<00:00, 299.57s/it]

```

```

+-----+
| NVIDIA-SMI 495.44      Driver Version: 460.32.03   CUDA Version: 11.2   |
+-----+-----+
| GPU  Name           Persistence-M| Bus-Id        Disp.A | Volatile Uncorr. ECC |
| Fan  Temp   Perf    Pwr:Usage/Cap|      Memory-Usage | GPU-Util  Compute M. |
|                                           | MIG M.         |
+-----+-----+-----+-----+-----+-----+
|    0   Tesla P100-PCIE...  Off  | 00000000:00:04.0 Off  |             0         |
| N/A    41C    P0      28W / 250W |    2MiB / 16280MiB   |      0%    Default   |
|                                           |                     | N/A         |
+-----+-----+-----+-----+-----+-----+

```

```

Epoch:  0%|          | 0/4 [00:00<?, ?it/s]Train lo
Epoch: 25%|███      | 1/4 [01:35<04:47, 95.71s/it]
Train loss: 0.3125095507168671
Epoch: 50%|██████    | 2/4 [03:11<03:11, 95.57s/it]
Train loss: 0.18029312002646478
Epoch: 75%|██████████  | 3/4 [04:46<01:35, 95.51s/it]
Train loss: 0.11255507657296678
Epoch: 100%|██████████████| 4/4 [06:22<00:00, 95.53s/it]

```

## Appendix III: Generic Text Completion with GPT-2

### Notebook settings

Hardware accelerator

GPU

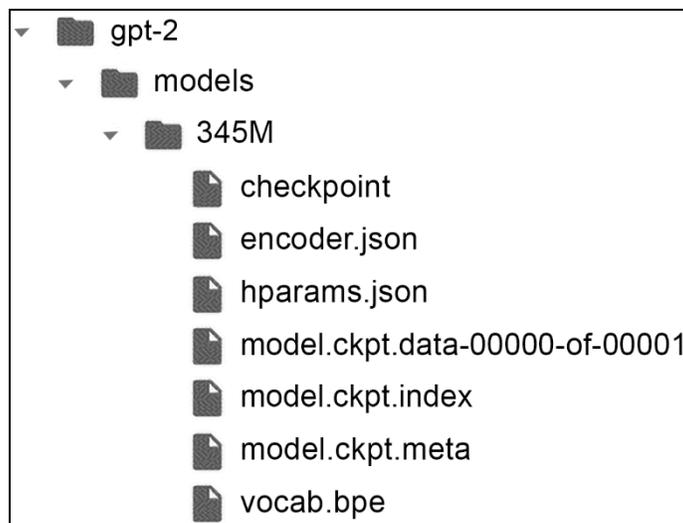
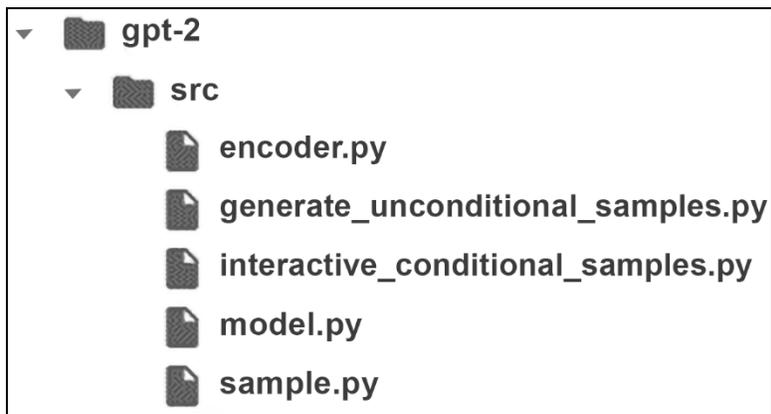


**Files**

Upload Refresh Mount Drive

<>

- ..
- gpt-2
  - src
    - CONTRIBUTORS.md
    - DEVELOPERS.md
    - Dockerfile.cpu
    - Dockerfile.gpu
    - LICENSE
    - README.md
    - domains.txt
    - download\_model.py
    - model\_card.md
    - requirements.txt



prompt >>>

## Appendix IV: Custom Text Completion with GPT-2

**@title Step 9: Training the Model**  
**Model saved after 1000 steps**

prompt >>>