

# Large pre-trained language models

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# Language modelling

- **Language modelling** is the task of predicting which word comes next in a sequence of words.
- More formally, given a sequence of words  $w_1, \dots, w_t$ , we want to know the probability of the next word,  $w_{t+1}$ :

$$P(w_{t+1} | w_1, \dots, w_t)$$

- Here we are assuming that  $w_{t+1}$  comes from a fixed vocabulary  $V$ .  
This allows language modelling to be treated as a classification task.



language modelling

- language modelling
- language modelling **nlp**
- language modelling **using lstm networks**
- language modelling **makes sense**
- language modelling **in python**
- language modelling **with rnn**
- language modelling **pytorch**
- language modelling **approach**
- language modelling **toolkit**
- language modelling **dataset**

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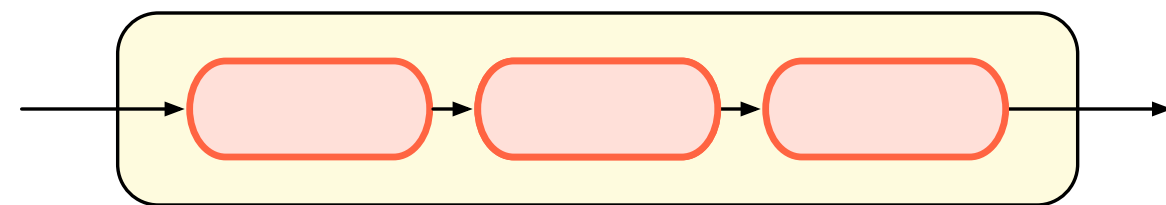
I'm Feeling Lucky

# Pre-training and fine-tuning

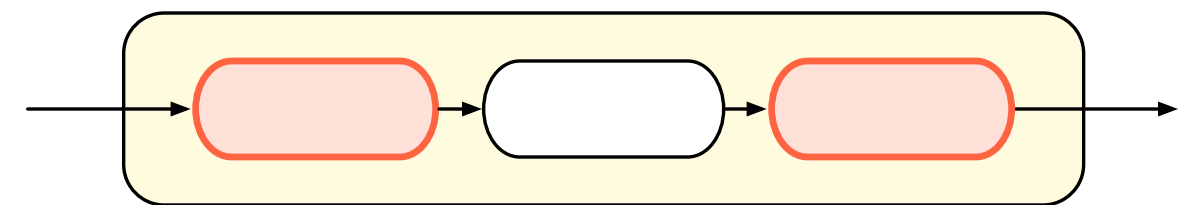
- **Transfer learning** aims to re-use knowledge gained while solving one problem when solving the next problem.

reduce the need for training data

- In contemporary NLP, transfer learning is usually implemented through **pre-training and fine-tuning**.



Model trained on task A



Model to be trained on task B

# Generative pre-training, discriminative fine-tuning

- Idea: Combine generative pre-training (language modelling) with discriminative fine-tuning on each task.
- Language modelling is a strong candidate for a pre-training task, as large unlabelled text corpora are abundant.  
at least for English ...
- To facilitate effective transfer learning, the authors use task-specific input transformations for fine-tuning.

# GPT as a language model

**Model prompt**  
(human-written)

In a shocking finding, scientist discovered a herd of unicorns living in a remote, previously unexplored valley, in the Andes Mountains. Even more surprising to the researchers was the fact that the unicorns spoke perfect English.

**Model completion**  
(machine-written)

The scientist named the population, after their distinctive horn, Ovid's Unicorn. These four-horned, silver-white unicorns were previously unknown to science. 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. Pérez and the others then ventured further into the valley. "By the time we reached the top of one peak, the water looked blue, with some crystals on top," said Pérez. Pérez and his friends were astonished to see the unicorn herd. These creatures could be seen from the air without having to move too much to see them – they were so close they could touch their horns. [...]

# Model statistics (largest models)

	GPT-1	GPT-2	GPT-3
Number of dimensions	768	1,600	12,288
Number of layers	12	48	96
<b>Trainable parameters</b>	<b>0.117 B</b>	<b>1.542 B</b>	<b>175 B</b>
Training data size (tokens)	800 M	(40 GB text)	499 B

[Radford et al. \(2018\)](#), [Radford et al. \(2019\)](#), [Brown et al. \(2020\)](#)

## Fine-tuning tasks used by Radford et al. (2018)

## GLUE Benchmark

### Classification

SST-2, CoLA

Predict the overall sentiment of a sentence: positive or negative

**Text:** It's definitely not dull.

**Label:** positive

### Natural language inference

SNLI, MultiNLI, Question NLI, RTE

Determine the logical relation between two sentences: entailment, contradiction, neutral

**Premise:** A man inspects the uniform of a figure in some East Asian country.

**Hypothesis:** The man is sleeping.

**Label:** contradiction

### Sentence similarity

MSR Paraphrases, QQP, STS

Rate the similarity of two sentences on a scale between 0–5

**Sentence 1:** Two boys on a couch are playing video games.

**Sentence 2:** Two boys are playing a video game.

**Similarity score:** 4

### Question answering

RACE, Story Cloze

Answer multiple-choice reading comprehension questions based on a text

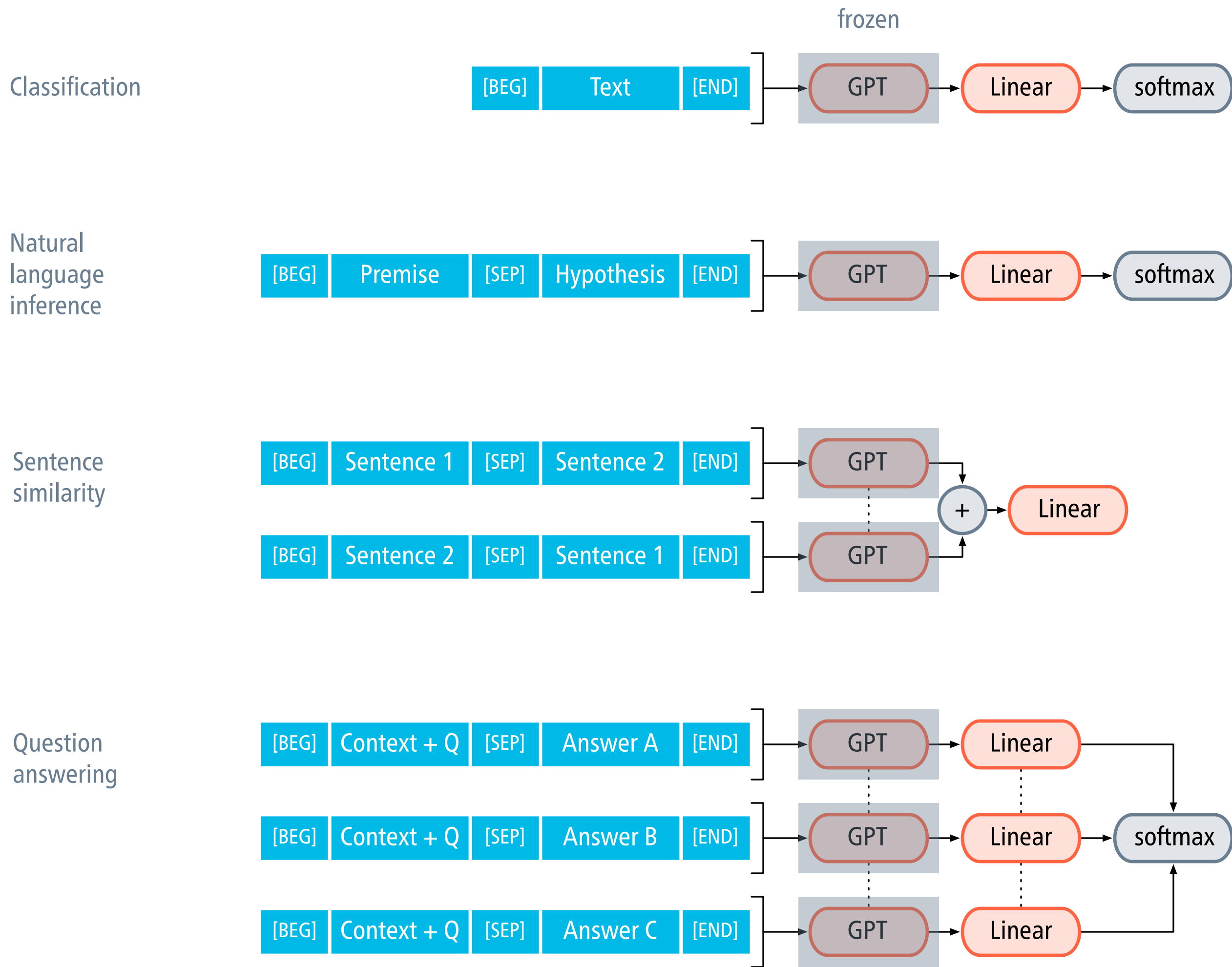
**Question:** The first postage stamp was made ...

**Candidate answers:** A. in England, B. in America, C. by Alice, D. in 1910



# Fine-tuning on classification tasks

- For fine-tuning on classification, the final transformer block's output is fed into an added linear layer followed by a softmax.
- The transformer is frozen; the only extra parameters introduced in fine-tuning are those of the added linear layer.



# Large language models are zero-shot learners

- Many downstream tasks are directly or indirectly ‘demonstrated’ in the text used for training language models.

translation: dictionaries, product manuals written in several languages

- Language models may learn these tasks as a by-product of learning to predict the demonstrating text.
- Large language models can solve downstream tasks without any task-specific fine-tuning; they are **zero-shot** learners.

# Prompting for natural language processing

## Sentiment classification

Tweet: I hate it when my battery dies.

Sentiment: Negative

Tweet: My day has been great!

Sentiment: Positive

Tweet: This music video was incredible!

Sentiment: **Positive**

## Machine translation

Translate English to French:

sea otter => loutre de mer

peppermint => menthe poivrée

plush giraffe => girafe en peluche

cheese => **fromage**

black text provided by the user, red text generated by GPT-3