Why I think reinforcement learning can solve the hallucination problem

The Transformer is an extremely **compressive** algorithm, due to its sharing the Q, K, V matrices across every layer (though there may be 100's of layers):

text corpus
$$(Q, K, V)$$
 text corpus
$$(1)$$

As a learning machine has only a finite number of weights (parameters), when it is "forced" to predict and re-construct the data, it must learn the abstract rules or patterns of the data.

Occam's razor is the idea that knowledge is acquired by finding the simplest explanations of the world (data).

Reinforcement learning is special in that it puts logic inference into a **closed loop**, ie, repeatedly iterating a **transition function**:



Under this setting, the transition function will be forced to explain the world with a compact set of rules, thus acquiring the knowledge / intelligence needed to discern truth from falsehood, thus solving the hallucination problem.

Indeed, the GPT / Transformer is already doing something like this, although it does not have an explicit closed-loop as in RL, it is still trained with an implicit loop over all data (the corpus).

My hope is for RL's closed loop to increase the **re-use** of logic rules, thus increasing the model's intelligence – according to Occam's razor.



Two architectures

Recall that the **Auto-Encoder** (AE) has the dual functions of **compression** and **predicting the future**, so we use this symbol for it:

$$(3)$$

We can think of two architectures, based on how we interpret the functions of an Auto-Encoder.

Architecture #1: AE emulates human thinking.



Thoughts = natural-language sentences. RL puts inference into a closed loop. Thoughts describe the world.

Architecture #2: AE = compressed world model.



Thoughts = hidden / latent state. RL helps AE to explain the world, successful explanations reward RL.

Which architecture is correct?

It may appear strange that AE has two different interpretations. Because

human thinking
$$\subset$$
 world, (6)

we can see that human thinking, as appears in text corpuses, can sometimes be wrong due to eg. lying, false beliefs, etc. Therefore Arch #1 can be faulty and may be the origin of hallucinations.

3

Why iteration is important

Consider the following simplified scenario:

3 binary inputs,
$$2^3 = 8$$
 states = $\{0...7\}$

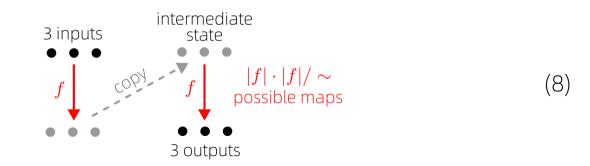
• • •

 $f: 8 \rightarrow 8 = 8^8 = 16777216$ possible maps

• • •

3 binary outputs, $2^3 = 8$ states = $\{0...7\}$

If $f \in \mathcal{F} = 8^8$ then all possible mappings are learnable. In general the family of f may be a subset of all possible maps, as long as some solution(s) exist in \mathcal{F} .



About our group

We operate as a **DAO** (decentralized autonomous organization) based on transparent operations and reward system based on weighted voting, to enable global collaboration without racial (or other forms of) discrimination.

Our values:

- democracy
- freedom of speech
- racial equality
- transparency
- tolerance of mistakes
- a learning environment

It is OK for anyone to challenge other member's theories, ideas, proposals, etc.