## How does AI work?

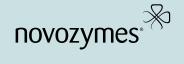
Dennis Pultz, Science Manager of AI

Bioinformatics & Design, Novozymes

**DIFI seminar: How will AI affect patent work?** 14th November, 2023

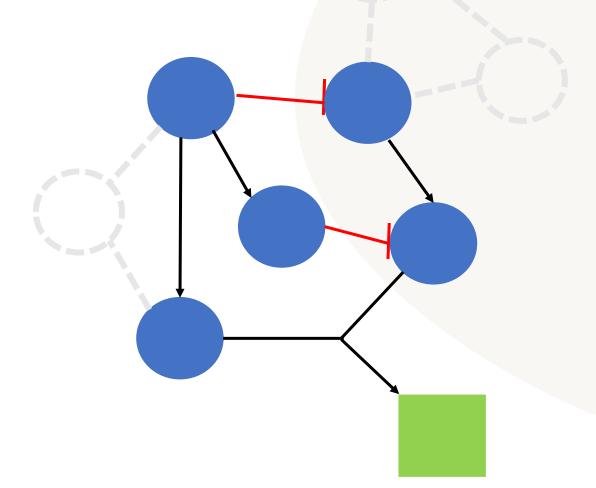


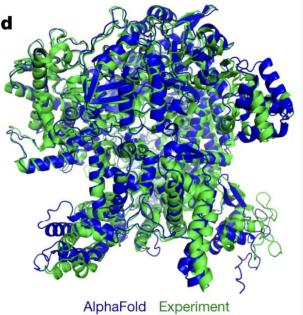




### Introduction

• Biology and AI: A great match





AlphaFold Experiment r.m.s.d.<sub>95</sub> = 2.2 Å; TM-score = 0.96

Agenda

• How does it work?



• Why Deep learning?



• What is chatGPT?

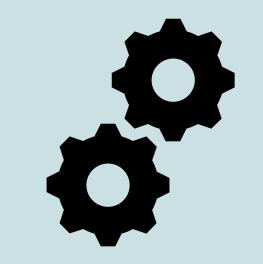


• Al Hype



chatGPT limitations

## HOW DOES IT WORK?



#### How does it work: Classifying species

#### Iris versicolor



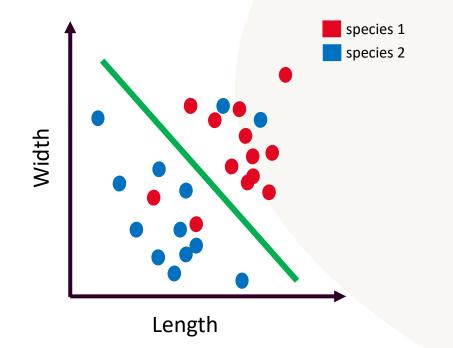
Iris setosa

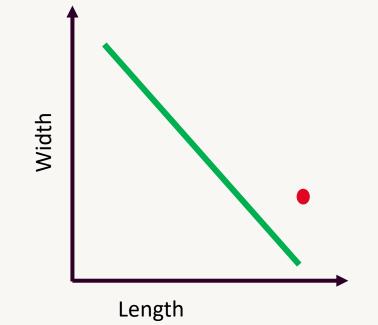
VS



novozymes<sup>.</sup>

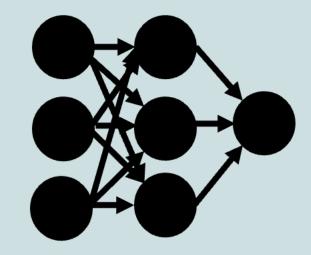
## Supervised Learning





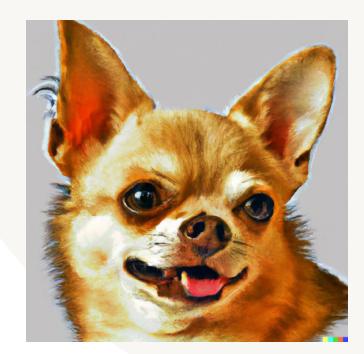
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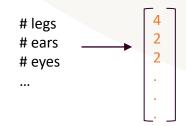
# WHY DEEP LEARNING?



## **Chihuahua-detector**

• Feature engineering



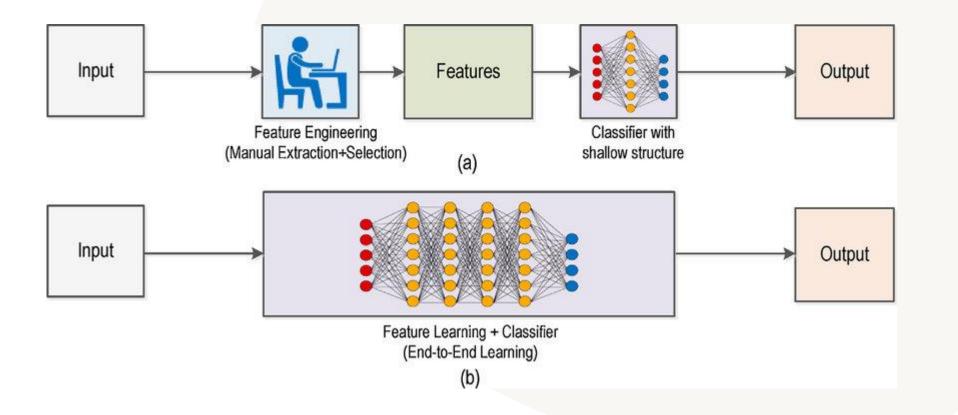




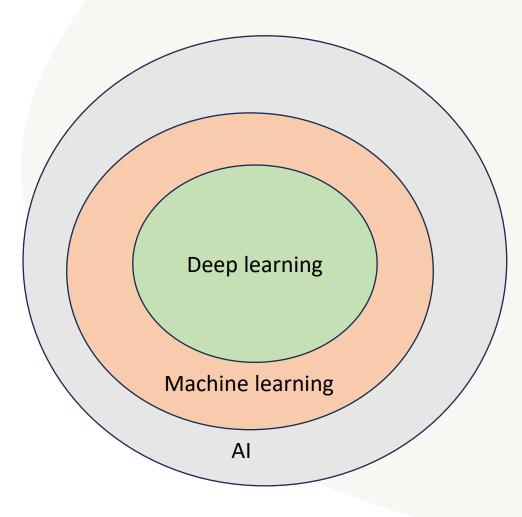
#### Chihuahua vs. muffin



#### **Deep Learning**



#### AI, Machine Learning... Deep Learning...???

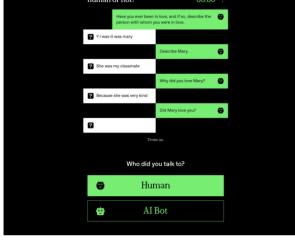


# WHAT IS ChatGPT?



#### **ChatGPT: Taking AI chatbots to the next level**

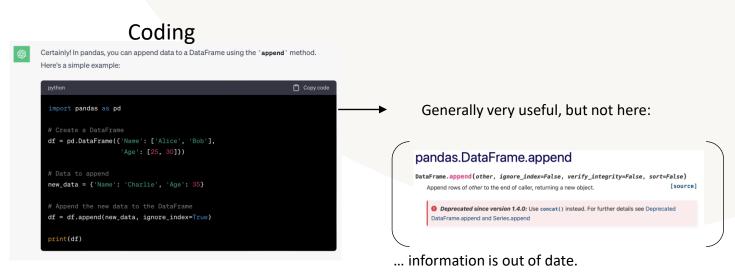
#### Human or not?



#### Al21 Labs

#### Writing jokes

- Sure thing! Let's get those giggles going:
- Q: Why did the scarecrow become a successful stand-up comedian?
  A: Because he was outstanding in his field!
- Q: What do you call a fish wearing a crown?
  - A: A kingfish!
- Q: Why did the math book look sad?
  A: Because it had too many problems.
- Q: How do you organize a space party?
  A: You planet!
- Q: What did one plate say to another plate?
  A: Tonight, dinner's on me!



#### **GPT: Generative Pre-trained Transformer**

#### **Discriminative Models**







#### **Generative Models**







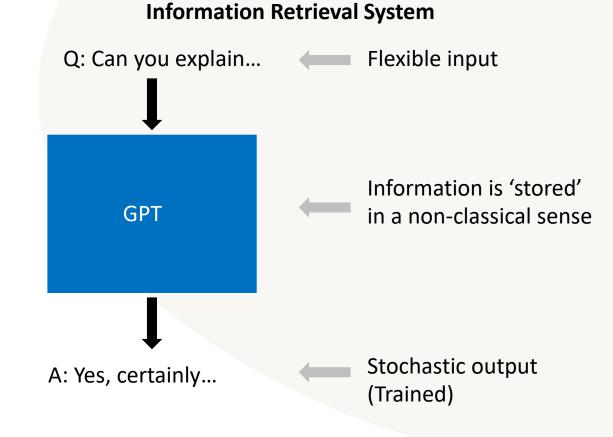
novozymes



#### Training sentence: "All the very best"

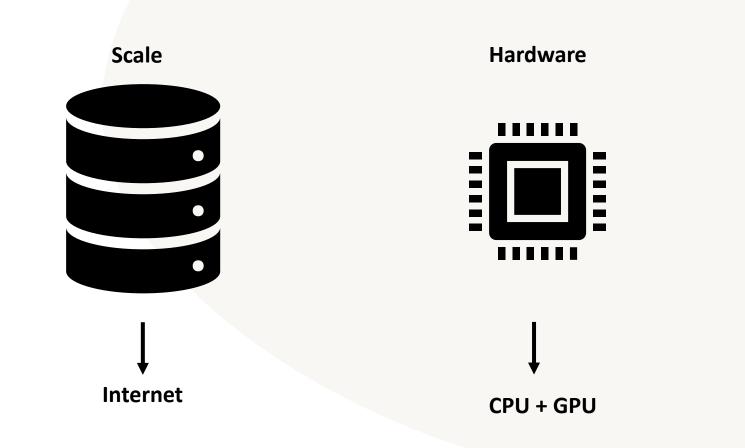
<u>https://towardsdatascience.com/understanding-masked-language-models-mlm-and-causal-language-models-clm-in-nlp-194c15f56a5; https://en.wikipedia.org/wiki/Giant\_panda; https://en.wikipedia.org/wiki/Polar\_bear</u>

#### **GPT: Generative Pre-trained Transformer**

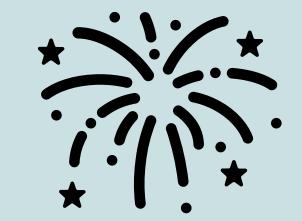


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#### What drives the progress?



## AI HYPE



#### Al Hype

#### TECH · A.I.

CEO of Google's DeepMind says we could be 'just a few years' from A.I. that has human-level intelligence

BY TRISTAN BOVE



AI experts say 'the game is over' as Google nears humanlevel artificial intelligence

Sam Altman says we will have "unlimited intelligence and energy" before the decade it out



able of playing videogames, chatting, stacking blocks with a til Al overtakes us

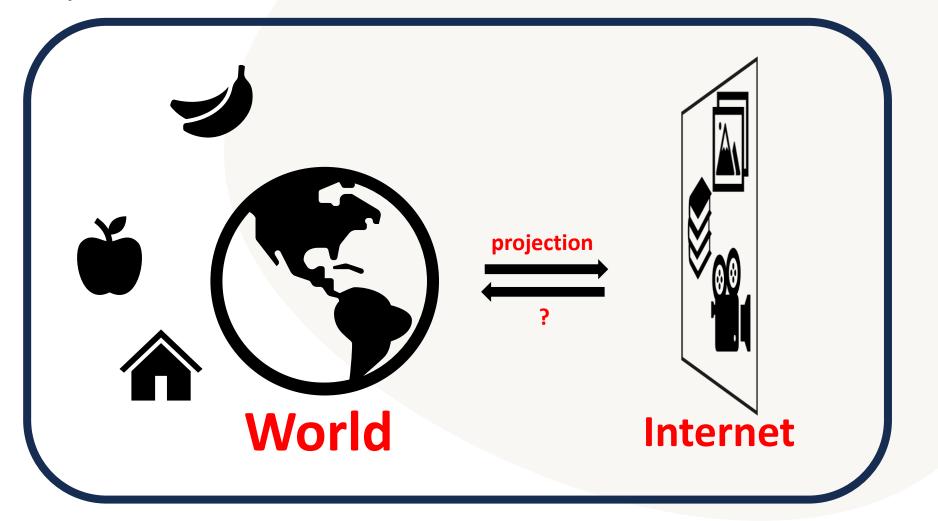
#### **Vocabulary in AI**





# ChatGPT LIMITATIONS

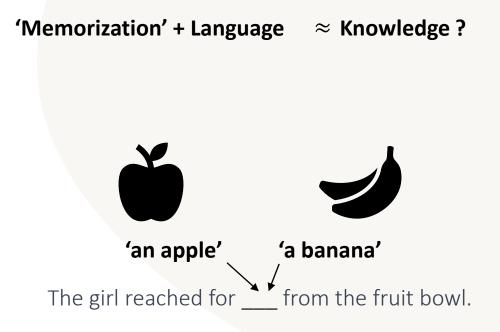
• The world is complex



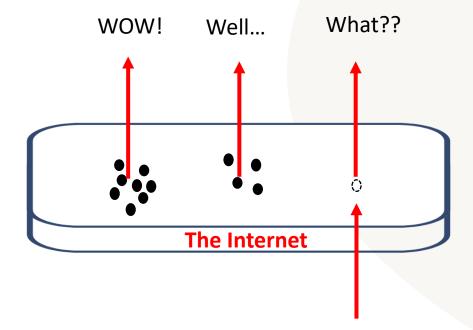
novozymes<sup>.</sup>

The internet is a projection of the world

• Language vs. knowledge



• Interpolation vs. extrapolation



True novelties (e.g. Innovations) are here



Pretraining Data Mixtures Enable Narrow Model Selection Capabilities in Transformer Models

> Steve Yadlowsky, Lyric Doshi, Nilesh Tripuraneni {yadlowsky, lyric, nileshtrip}@google.com Google DeepMind

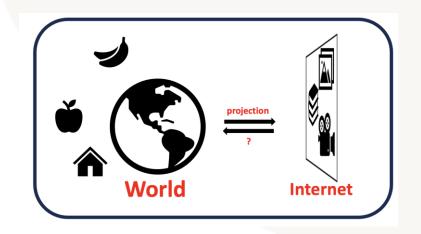
> > November 3, 2023

#### Abstract

Transformer models, notably large language models (LLMs), have the remarkable ability to perform in-context learning (ICL) – to perform new tasks when prompted with unseen inputoutput examples without any explicit model training. In this work, we study how effectively transformers can bridge between their pretraining data mixture, comprised of multiple distinct task families, to identify and learn new tasks in-context which are both inside and outside the pretraining distribution. Building on previous work, we investigate this question in a controlled

• Context matters

Turn of the light, when you leave the room



• Context matters: what is a pen?



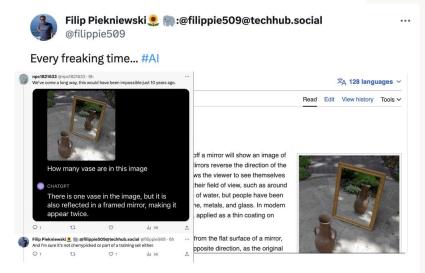






NOT an intrinsic property of the object itself – depends on external factors

• Benchmarking is difficult



Benchmarking on training set + Techno-optimistic confirmation bias

FORBES > INNOVATION > CONSUMER TECH

John Koetsier Senior Contributor 💿

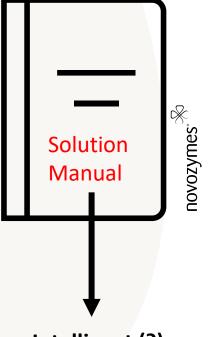
Journalist, analyst, author, and speaker.

#### GPT-4 Beats 90% Of Lawyers Trying To Pass The Bar

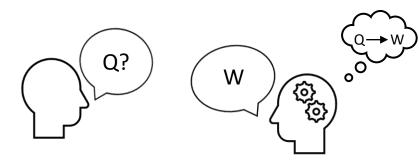


"Companies that are slow to adopt AI will be left behind – large and small," says IDC analyst Mike Glennon. "AI is best used in

Follov



Intelligent (?)



Our questions are ordinary - have been asked before

#### Conclusion

• AI / Machine learning has great potential

### • Knowing limitations is important

• chatGPT is a **tool** 

• Future applications: Benchmark!

