

Generative Artificial Intelligence on edge, multimodality

July 20th 2023

Marc Duranton

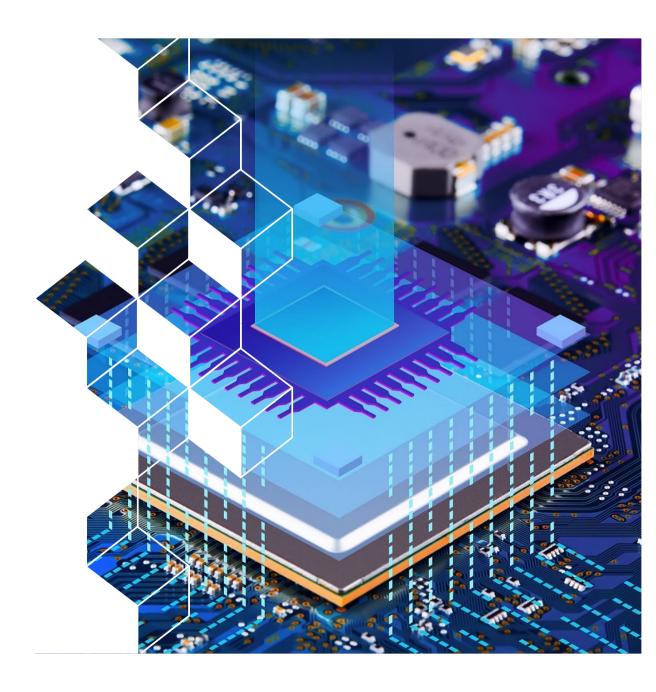
Senior fellow

CEA



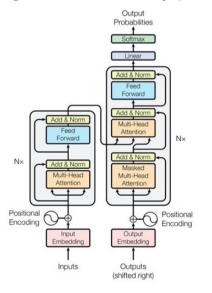
Large Language Models

and their ecosystem



2017: Transformers

"We propose a new simple network architecture, the **Transformer**, **based** solely on **attention mechanisms**, dispensing with recurrence and convolutions entirely. Experiments on two machine translation tasks show these models to be superior in quality while being more parallelizable and requiring significantly less time to train. On the WMT 2014 English-to-French translation task, our model establishes a new single-model state-of-the-art BLEU score of 41.8 after training for 3.5 days on eight GPUs, a small fraction of the training costs of the best models from the literature. We show that the Transformer generalizes well to other tasks by applying it successfully to English constituency parsing both with large and limited training data. "



Attention Is All You Need

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Transformers work well for text (sequence of tokens).

"However, attention mechanisms were powerful in themselves and that sequential recurrent processing of data was not necessary to achieve the quality gains of RNNs with attention. Transformers use an attention mechanism without an RNN. processing all tokens simultaneously <context windows> and calculating between attention weights them in successive layers. Since the attention mechanism only uses information about other tokens from lower lavers, it can be computed for all tokens in parallel, which leads to improved training speed. "

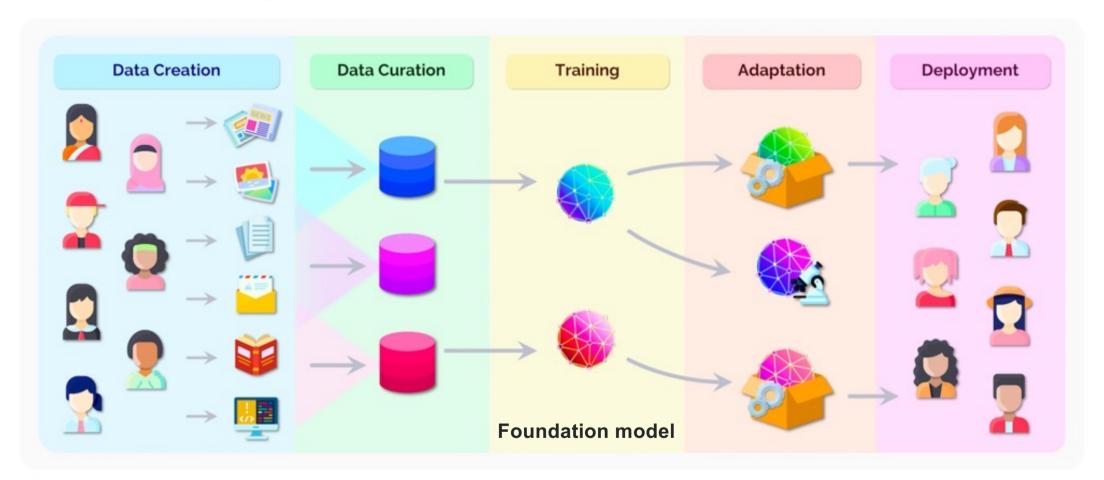
From:

https://en.wikipedia.org/wiki/Transformer_(machine_learning_model)





The ecosystem of LLMs



From « On the Opportunities and Risks of Foundation Models » https://arxiv.org/abs/2108.07258



The ecosystem of LLMs



From « On the Opportunities and Risks of Foundation Models » https://arxiv.org/abs/2108.07258





ChatGPT: Reinforcement Learning with Human Feedback

ChatGPT:

« OpenAl's outsourcing partner in Kenya was Sama, a San Franciscobased firm that employs workers in Kenya, Uganda and India to label data for Silicon Valley clients like Google, Meta and Microsoft.»

Step 1

Collect demonstration data. and train a supervised policy.

A prompt is sampled from our prompt dataset.

A labeler demonstrates the desired output behavior.

This data is used to fine-tune GPT-3 with supervised learning.



Step 2

Collect comparison data, and train a reward model.

Explain the moon

landing to a 6 year old

G

Moon is natura

0

People went to

A prompt and several model outputs are sampled.

A labeler ranks the outputs from best to worst.

This data is used to train our reward model.

Step 3

Optimize a policy against the reward model using reinforcement learning.

A new prompt is sampled from the dataset.

The policy generates an output.

The reward model calculates a reward for the output.

The reward is used to update the policy

Write a story about frogs Once upon a time..

usina PPO. From https://openai.com/research/instruction-following

From https://time.com/6247678/openai-chatgpt-kenya-workers/



Evolution of Generative Pre-trained Transformers. (GPT) in OpenAl



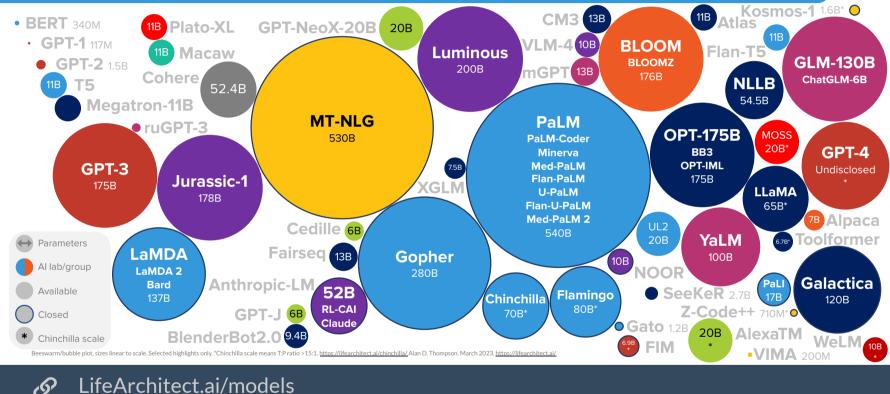
Model	Architecture	Parameter count	Training data	Release date	Training cost	Compute requirement
GPT-1	12-level, 12-headed Transformer decoder (no encoder), followed by linear- softmax.	117 million	BookCorpus: 4.5 GB of text, from 7000 unpublished books of various genres.	June 11, 2018	"1 month on 8 GPUs", or 1.7e19 FLOP.	~ x 10
GPT-2	GPT-1, but with modified normalization	1.5 billion	WebText: 40 GB of text, 8 million documents, from 45 million webpages upvoted on Reddit.	February 14, 2019 (initial/limited version) and November 5, 2019 (full version)	"tens of petaflop/s-day", or 1.5e21 FLOP.	~ x 20
GPT-3	GPT-2, but with modification to allow larger scaling	175 billion	499 Billion tokens consisting of CommonCrawl (570 GB), WebText, English Wikipedia, and two books corpora (Books1 and Books2).	May 28, 2020	3640 petaflop/s-day, or 3.2e23 FLOP.	~ x 10
<u>GPT-3.5</u>	Undisclosed	175 billion	Undisclosed	March 15, 2022	Undisclosed	
GPT-4	Also trained with both text prediction and RLHF; accepts both text and images as input. Further details are not public.	Undisclosed (1.8 trillon aka 1.8e12)	Undisclosed (13 trillon tokens, aka 1.3e13)	March 14, 2023	Undisclosed. Estimated 2.1e25 FLOP.	

From https://en.wikipedia.org/wiki/Generative_pre-trained_transformer





LANGUAGE MODEL SIZES TO MAR/2023

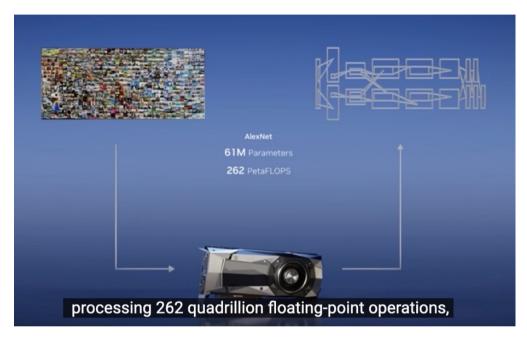


6

From Dr Alan D. Thompson, LifeArchitect.ai, https://lifearchitect.ai/models/#laptop-models



Computing power is driving the advance of Al



2012: AlexNet
GeForce GTX 580
Won ImageNet Challenge
262 x 10¹⁵ FLOPS

From GTC 2023 Keynote with NVIDIA CEO Jensen Huang



2020: GPT-3 323 x 10^{21} FLOPS X 1 000 000 more floating point operations



Training Large Language Models is not cheap!





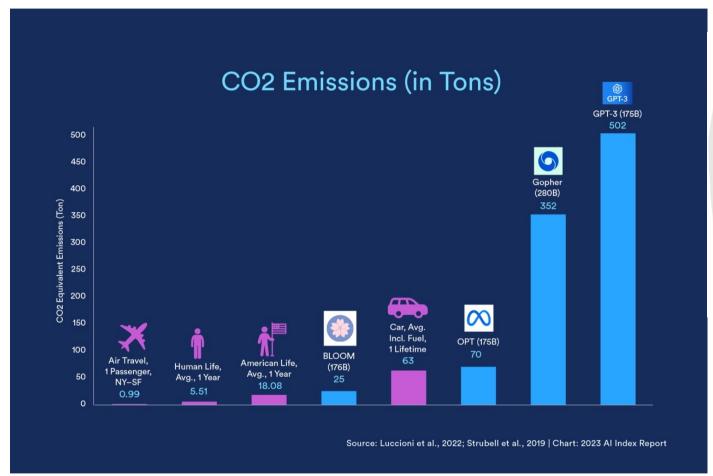
The estimated **training cost for GPT-4 is around \$63 million**.

From "2023 State of AI in 14 Charts" available at https://hai.stanford.edu/news/2023-state-ai-14-charts



Training Large Language Models has an ecological impact





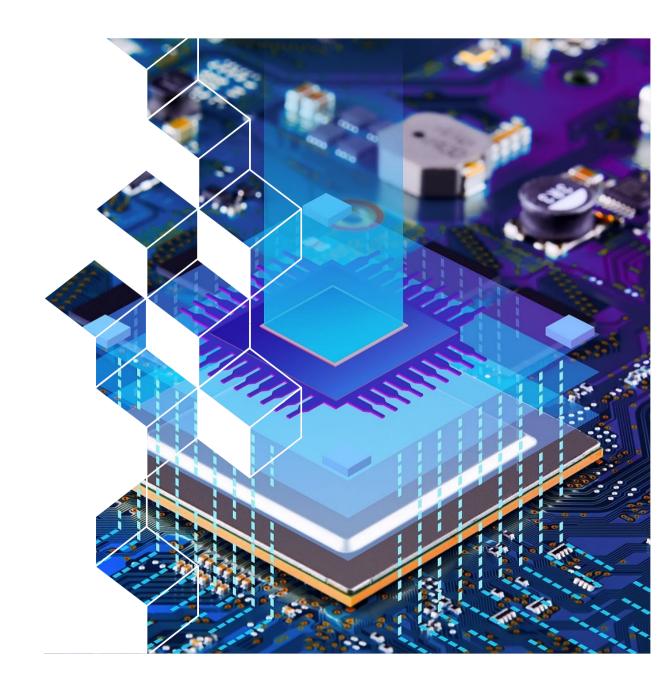


From https://www.hipeac.net/vision/#/latest/

From "2023 State of AI in 14 Charts" available at https://hai.stanford.edu/news/2023-state-ai-14-charts

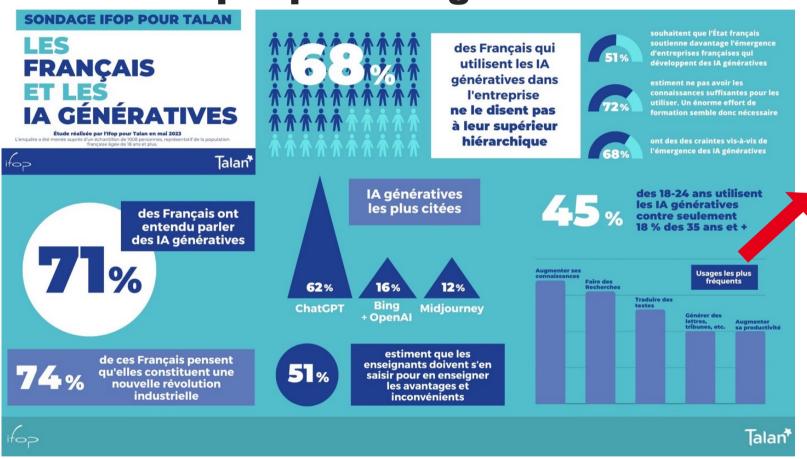


Examples of applications





French people and generative Al



Most frequent utilizations:

- Increase knowledge
- Information search
- Translate texts
- Create letters, blogs, ...
- Increase its own productivity
-

From https://talan.com/actualites/detail-actualites/news/sondage-ifop-talan-les-francais-et-les-ia-generatives/
Full report available from https://www.ifop.com/publication/le-regard-des-francais-et-des-actifs-sur-les-ia-generatives/



LLMs for image generation

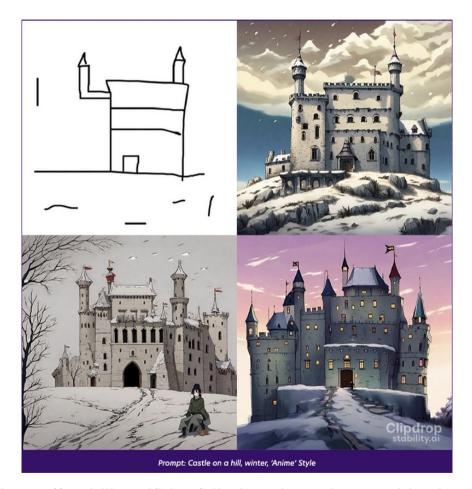




From https://www.hipeac.net/vision/#/latest/



Image generation from sketches





https://stability.ai/blog/clipdrop-launches-stable-doodle



LLMs for software programming



- Generating (small) pieces of code
- · Get code from comments
- Chat to help programming
- Explain code
- Show examples
- Refactoring
- Create README
- Etc...



From https://www.hipeac.net/vision/#/latest/

Example: GitHub Copilot

"What is GitHub Copilot?

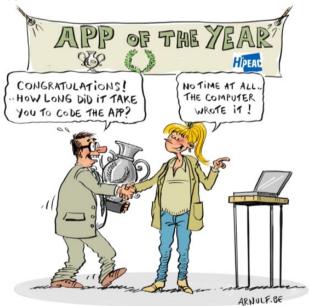
GitHub Copilot is an AI pair programmer that helps you write code faster and with less work. It draws context from comments and code to suggest individual lines and whole functions instantly. GitHub Copilot is powered by OpenAI Codex, a generative pretrained language model created by OpenAI. It is available as an extension for Visual Studio Code, Visual Studio, Neovim, and the JetBrains suite of integrated development environments (IDEs)."

from https://github.com/features/copilot

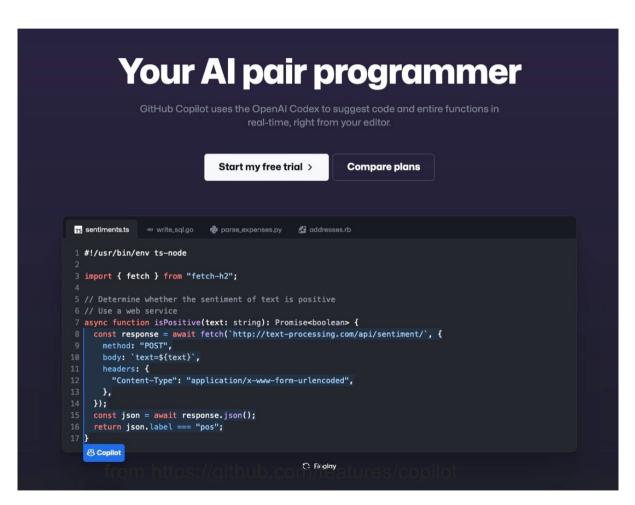
LLMs for software programming



- Generating (small) pieces of code
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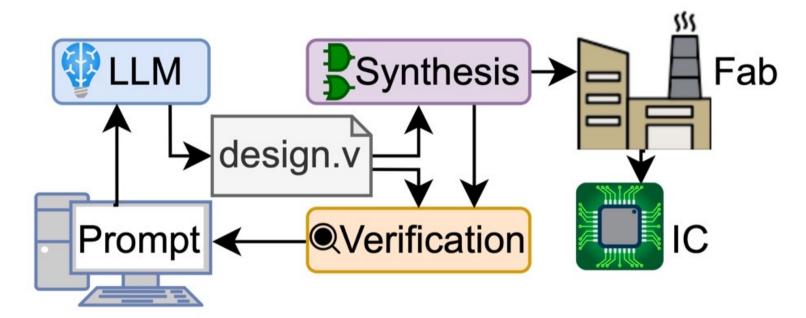


From https://www.hipeac.net/vision/#/latest/





Chip-Chat: Challenges and Opportunities in Conversational Hardware Design



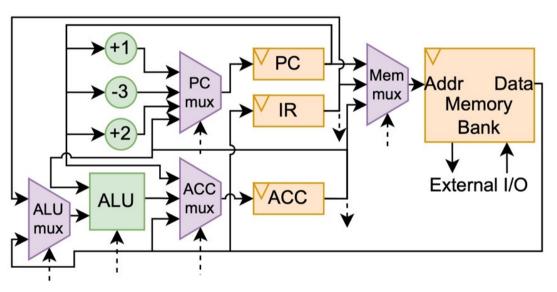
Can conversational LLMs be used to iteratively design hardware?

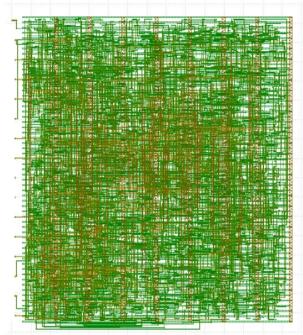
From https://arxiv.org/abs/2305.13243





Chip-Chat: Challenges and Opportunities in Conversational Hardware Design





Component	Count		
Comb. Logic	999		
Diode	4		
Flip Flops	168		
Buffer	126		
Tap	300		

Above: (a) Components.

Left: (b) Final processor GDS render by 'klayout', I/O ports on left side, grid lines = 0.001 um.

Fig. 14. Processor synthesis information.

From https://arxiv.org/abs/2305.13243



Chip-Chat: conclusion

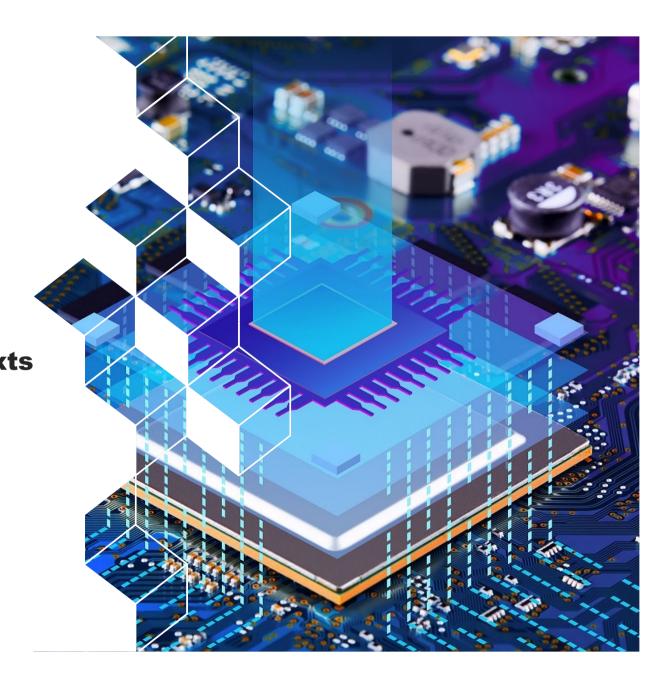
"Challenges: While it is clear that using a conversational LLM to assist in designing and implementing a hardware device can be beneficial overall, the technology is not yet able to consistently design hardware with only feedback from verification tools. The current state-of-the-art models do not perform well enough at understanding and fixing the errors presented by these tools to create complete designs and testbenches with only an initial human interaction.

Opportunities: Still, **when the human feedback is provide**d to the more capable ChatGPT-4 model, or it is used to co-design, **the language model seems to be a 'force multiplier', allowing for rapid design space exploration and iteration.** In general, ChatGPT-4 could produce functionally correct code, which could free up designer time when implementing common modules. Potential future work could involve a larger user study to investigate this potential, as well as the development of conversational LLMs specific to hardware design to improve upon the results."

From https://arxiv.org/abs/2305.13243



Multimodality
LLMs are good not only on texts



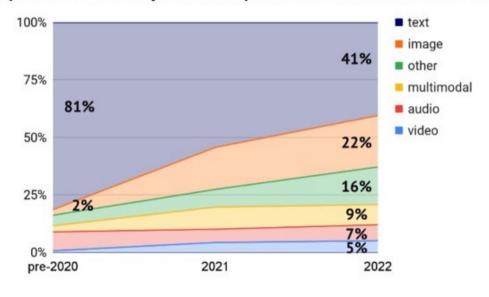
From text to multi-modal in 2 years

Introduction | Research | Industry | Politics | Safety | Predictions

#stateofai | 42

Transformers are becoming truly cross-modality

In the 2020 State of AI Report we predicted that transformers would expand beyond NLP to achieve state of the art in computer vision. It is now clear that transformers are a candidate general purpose architecture. Analysing transformer-related papers in 2022 shows just how ubiquitous this model architecture has become.



stateof.ai 2022

☑ Zeta Alpha



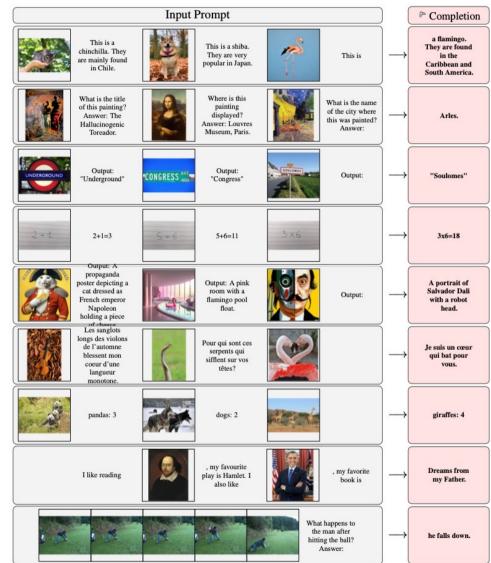




Flamingo: a Visual Language Model for Few-Shot Learning

Jean-Baptiste Alayrac*,‡ Jeff Donahue* Pauline Luc* Antoine Miech* Katie Millican† Iain Barr† Yana Hasson Karel Lenc† Arthur Mensch† Malcolm Reynolds† Roman Ring† Eliza Rutherford† Serkan Cabi Tengda Han **Zhitao Gong** Sina Samangooei Marianne Monteiro Jacob Menick Sahand Sharifzadeh Sebastian Borgeaud **Andrew Brock** Aida Nematzadeh Mikolaj Binkowski Ricardo Barreira **Oriol Vinyals** Andrew Zisserman Karen Simonyan*,‡

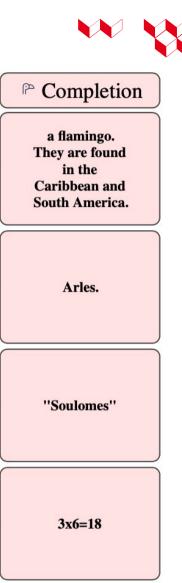
DeepMind



^{*} Equal contributions, ordered alphabetically, † Equal contributions, ordered alphabetically, † Equal senior contributions

Flamingo (Deepmind): image + text + few shot learning

Input Prompt





This is a chinchilla. They are mainly found in Chile.



This is a shiba. They are very popular in Japan.



This is



What is the title of this painting?
Answer: The Hallucinogenic Toreador.



Where is this painting displayed? Answer: Louvres Museum, Paris.



What is the name of the city where this was painted?

Answer:



Output: "Underground"



Output: "Congress"



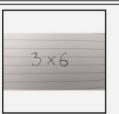
Output:



2+1=3



5+6=11

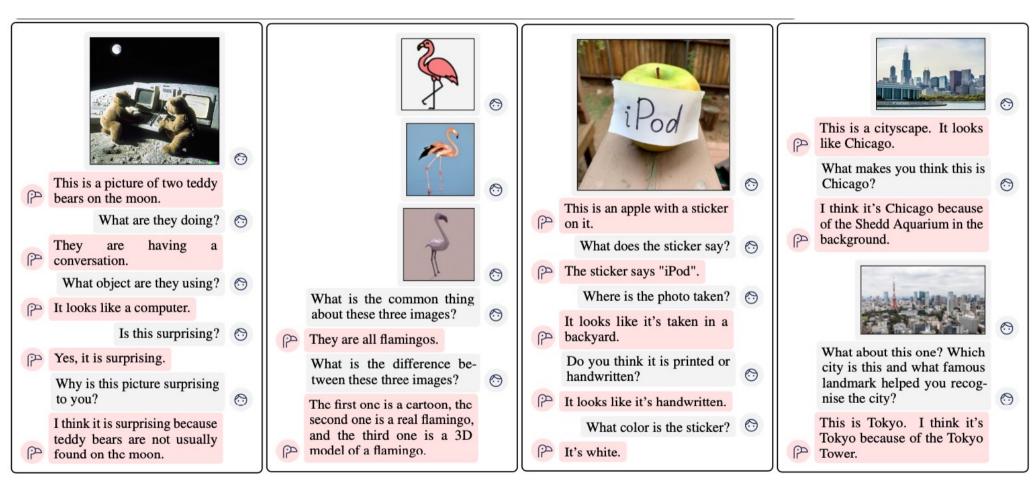


Outgut: A



Flamingo: understanding images





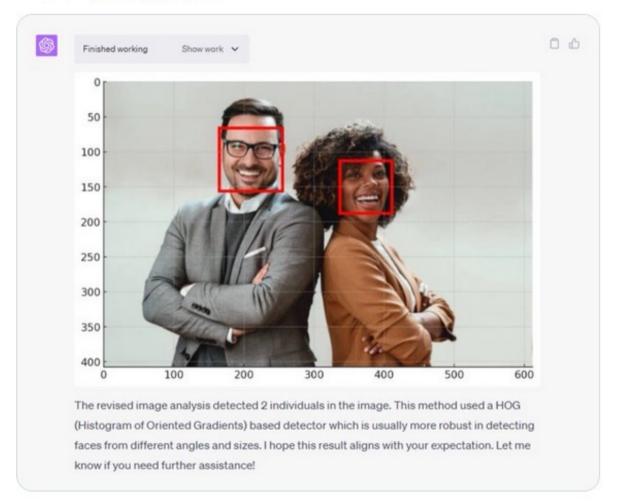




GPT-4 (OpenAl)

- Prompt: How many individuals are in this image?

- Author: @DeutschJush

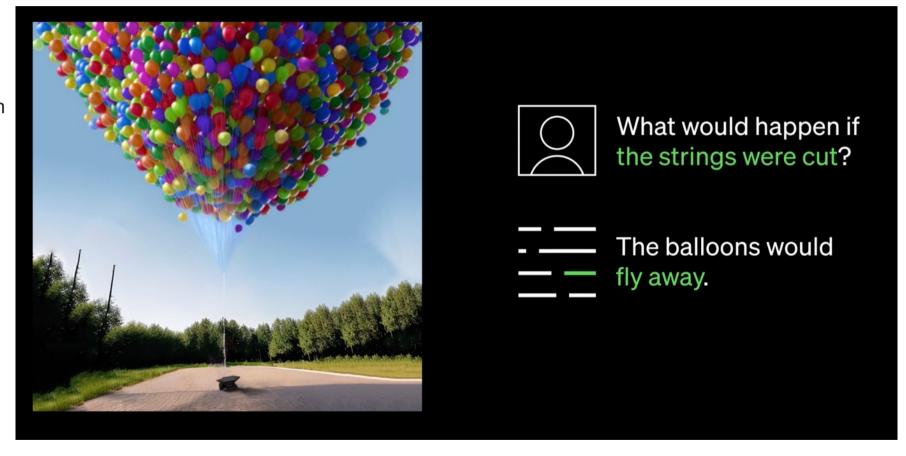


With "Code interpreter", GPT-4 can process images

GPT-4 (OpenAI)



But also GPT-4 can Process images natively...







Bard (Google)



What would happen if the strings were cut?









If the strings were cut, the balloons would fall. The balloons are filled with helium, which is a lighter-than-air gas. This means that the balloons will rise until they reach a height where the air pressure is equal to the pressure inside the balloons. If the strings were cut, the balloons would no longer be tethered to the ground and would simply float away.

The image you sent shows a bunch of colorful balloons flying over a road. If the strings were cut, the balloons would likely drift away and eventually land somewhere else. They could land in a field, a park, or even a body of water. It's also possible that the balloons could get caught in power lines or other objects, which could cause them to pop.

It's important to be careful when releasing balloons, as they can pose a hazard to people and animals. If you're planning to release balloons, make sure to do it in a safe area where they won't be a nuisance or a danger.

From https://bard.google.com/



Bard







The image shows a robotic hand pressing a button on a blue background. The hand is wearing a black glove and has five fingers, each with three joints. The putton is write and has a plue porger. The background is a solid blue color.

The text in the image reads:

FIEEC WEBINAIRE Jeudi 20 juillet 2023 de 8h30 à 10h IA GENERATIVE - CHAT GPT Quelles incidences pour nos industries? #INNOVTECH

This text translates to:

FIEEC WEBINAR Thursday, July 20, 2023 from 8:30 to 10:00 AM Generative AI - GPT Chat What are the implications for our industries? #INNOVTECH

The image is likely promoting a webinar about the implications of generative AI and chatbots for industry. The robotic hand pressing the button suggests that the webinar will discuss how these technologies can be used to automate tasks and improve efficiency.

The image is well-designed and eye-catching. The use of contrasting colors makes the text and button stand out against the blue background. The robotic hand is also rendered in a realistic way, which helps to create a sense of interest and intrigue.

Overall, the image is an effective way to promote the webinar and generate interest in the topic of generative AI and chatbots.



From https://bard.google.com/

View other drafts V

Generative Al on the edge

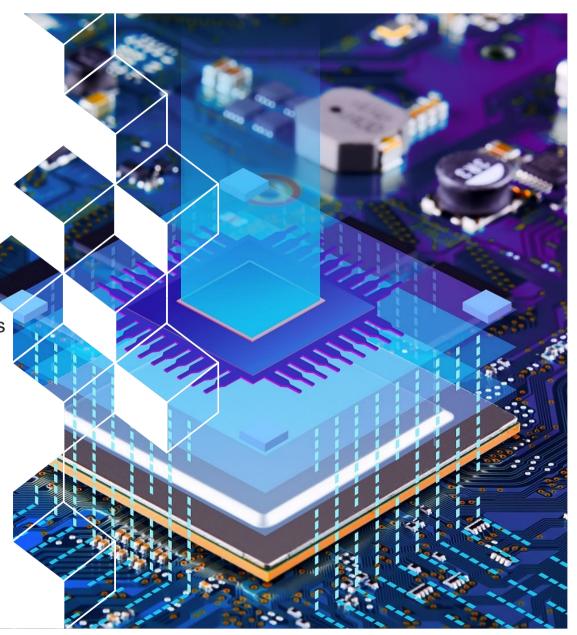
Foundation models & *locally running* fine tuned models

How to avoid sending your sensible information?

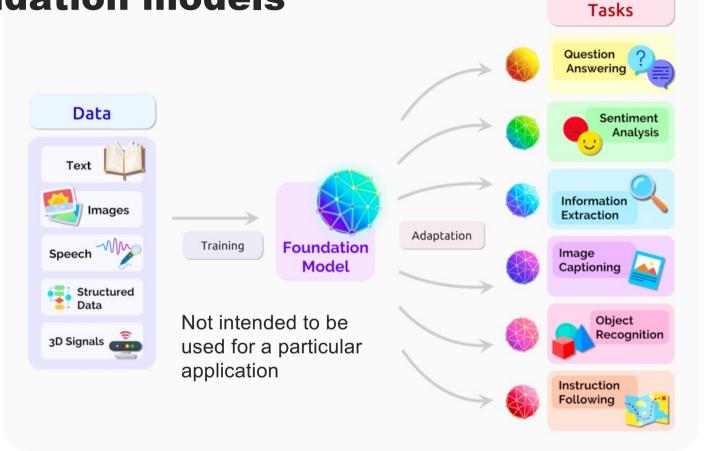
Vulnerabilities/Threats 4 MIN READ 13 NEWS

Samsung Engineers Feed Sensitive Data to **ChatGPT, Sparking Workplace AI Warnings**

In three separate incidents, engineers at the Korean electronics giant reportedly shared sensitive corporate data with the Al-powered chatbot.



Foundation models



« A **foundation model** can centralize the information from all the data from various modalities. This one model can then be adapted to a wide range of downstream tasks. »

From « On the Opportunities and Risks of Foundation Models » https://arxiv.org/abs/2108.07258



One of the early Open Source LLM (March-July 2022)

BigScience

BLOOM: open-source alternative to GPT-3



https://bigscience.huggingface.co

https://huggingface.co/bigscience/bloom

1.5TB of text, 350B tokens

43 languages, 16 programming languages

118 days of training on 384 A100 GPUs

Estimated cost of training: Equivalent of \$2-5M in cloud Server training location: Île-de-France, France Environmental Impact: The training supercomputer, Jean Zay, uses mostly nuclear energy. The heat generated by it is reused for heating campus housing.

More details at https://huggingface.co/blog/bloom-megatron-deepspeed

Smaller versions are available: 560M, 1.1B, 1.7B, 3B, 7.1B

BLOOMZ models (same sizes) are fine-tuned for **instruction following**https://huggingface.co/bigscience/bloomz



Llama from Meta leaked on line, triggering multiplicity of derived models...





Pinned Tweet

Guillaume Lample @GuillaumeLample · Feb 24

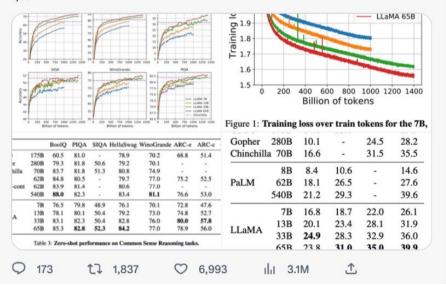
Today we release LLaMA, 4 foundation models ranging from 7B to 65B parameters.

LLaMA-13B outperforms OPT and GPT-3 175B on most benchmarks. LLaMA-65B is competitive with Chinchilla 70B and PaLM 540B.

The weights for all models are open and available at

research.facebook.com/publications/l...

1/n



Meta's powerful Al language model has leaked online – what happens now?



/ Meta's LLaMA model was created to help researchers but leaked on 4chan a week after it was announced. Some worry the technology will be used for harm: others say greater access will improve AI safety.

By James Vincent, a senior reporter who has covered Al, robotics, and more for eight years at The Verge



If you buy something from a Verge link, Vox Media may earn a commission. See our ethics statement.

From https://www.theverge.com/2023/3/8/23629362/meta-ai-language-model-llama-leak-online-misuse

Most info can be found on https://ai.meta.com/blog/large-language-model-llama-meta-ai/



The trigger: Alpaca from Stanford



Alpaca: A Strong, Replicable Instruction-Following Model

Authors: Rohan Taori* and Ishaan Gulrajani* and Tianyi Zhang* and Yann Dubois* and Xuechen Li* and Carlos Guestrin and Percy Liang and Tatsunori B. Hashimoto

We introduce Alpaca 7B, a model fine-tuned from the LLaMA 7B model on 52K instruction-following demonstrations. On our preliminary evaluation of single-turn instruction following, Alpaca behaves qualitatively similarly to OpenAl's text-davinci-003, while being surprisingly small and easy/cheap to reproduce (<600\$). Checkout our code release on <u>GitHub</u>.

Update: The public demo is now disabled. The original goal of releasing a demo was to disseminate our research in an accessible way. We feel that we have mostly achieved this goal, and given the hosting costs and the inadequacies of our content filters, we decided to bring down the demo.

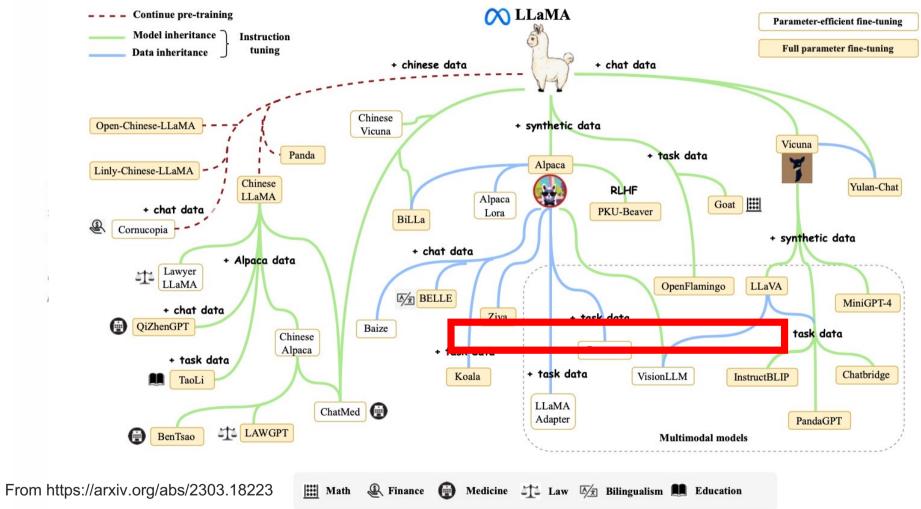


From https://crfm.stanford.edu/2023/03/13/alpaca.html



The trigger: Alpaca from Stanford







The trigger: Alpaca from Stanford





Introducing Llama 2

The next generation of our open source large language model

Llama 2 is available for free for research and commercial use.

News from July 18th, 2023,

you can play with it on https://www.llama2.ai/, you can download and run it locally You keep your data locally and no fees to use it (unlike GPT-4, \$20 a month)

From https://arxiv.org/abs/2303.18223

















The enabler: HuggingFace





The AI community building the future.

Build, train and deploy state of the art models powered by the reference open source in machine learning. Models 261.193 Filter by name new Full-text search ↑↓ Sort: Trending s. stabilitvai/stable-diffusion-xl-base-0.9 ## baichuan-inc/Baichuan-13B-Chat Text-to-Image • Updated 5 days ago • ± 154k • ♥ 992 Text Generation - Updated 5 days ago -
 ± 698k - ♥ 303 THUDM/chatglm2-6b ♠ Open-Orca/OpenOrca-Preview1-13B Text Generation - Updated about 15 hours ago - ± 603 - ♥ Updated about 7 hours ago - ± 1.28M - ♥ 1.12k ## baichuan-inc/Baichuan-13B-Base s. stabilityai/stable-diffusion-xl-refiner-0.9 Text Generation - Updated 5 days ago -
 ± 5.05k - ♥ 103 Image-to-Image - Updated 5 days ago - ± 44.4k - ♥ 244 ⇒ tiiuae/falcon-40b fb700/chatglm-fitness-RLHF Text Generation - Updated 4 days ago -
 ± 159k -
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 Updated 4 days ago - ♥ 95 11lyasviel/ControlNet-v1-1 runwayml/stable-diffusion-v1-5 Updated Apr 26 - ♥ 2k Text-to-Image - Updated 13 days ago - ±5.79M - ♥ 8.67k monster-labs/control_v1p_sd15_grcode_monster tiiuae/falcon-40b-instruct Updated 18 days ago - ± 1.58k - ♥ 170 Text Generation
 • Updated 4 days ago
 •
 ± 326k
 • ○ 993
 moka-ai/m3e-base ⇒ tiiuae/falcon-7b Updated 4 days ago - ± 86.4k - ♥ 315 Text Generation - Updated 4 days ago - 🕹 418k - 🗢 674 s. stabilityai/stable-diffusion-2-1 Imsvs/vicuna-33b-v1.3 Text Generation - Updated 16 days ago - ± 13.7k - ♥ 153 Text-to-Image - Updated 12 days ago - ₹ 787k - ♥ 2.88k bigcode/starcoder openai/whisper-large-v2 ™ Text Generation • Updated May 30 • ±54.9k • ♥ 2.07k & Automatic Speech Recognition - Updated May 5 - ± 158k -

From https://huggingface.co/





StarCoder: a model for helping coding

Model Summary

The StarCoder models are 15.5B parameter models trained on 80+ programming languages from The Stack (v1.2), with opt-out requests excluded. The model uses Multi Query Attention, a context window of 8192 tokens, and was trained using the Fill-in-the-Middle objective on 1 trillion tokens.

- Repository: <u>bigcode/Megatron-LM</u>
- Project Website: <u>bigcode-project.org</u>
- Paper: StarCoder: May the source be with you!
- Point of Contact: contact@bigcode-project.org
- Languages: 80+ Programming languages

From https://huggingface.co/bigcode/starcoder



StarCoder: a model for helping coding



Write a Python function to tell me what the date is today

Sure thing. Here goes...

```
from datetime import date
today = str(date.today()).replace('-', '/')
print("Today is " + today)
```

List the prime numbers between 20 and 30.

Here is a simple algorithm which uses trial division to find the prime numbers within a given interval.

```
primes = []
for num in range(20, 31):
    found = False
    for j in range(2,num//2):
        if ((num % j)==0):
            found = True
            break

if((found==False) & (num!= 1)):
            primes.append(num)
```

From https://arxiv.org/abs/2305.06161



LLM running locally on a Mac Mini

```
* 29
> Write a program that lists the prime numbers between 20 and 30.
Here is a program in Python that lists the prime numbers between 20 and 30:
def is prime(n):
    if n \le 1 or n \% 2 == 0:
        return False
    for i in range(3, int(n ** 0.5) + 1):
        if n \% i == 0:
            return False
    return True
def list primes(start, end):
    prime list = []
    for i in range(start, end + 1):
        if is prime(i):
            prime list.append(i)
    return prime list
print(list primes(20, 30))
This program uses the `is_prime` function to check whether a given number is pri
me or not. The `is_prime
```





Qualcomm Technologies, Inc. and Meta are working to optimize the execution of Meta's Llama 2 large language models directly ondevice – without relying on the sole use of cloud services.

4 Key Advantages of On-Device Al



From https://www.qualcomm.com/news/releases/2023/07/qualcomm-works-with-meta-to-enable-on-device-ai-applications-usi



Limitations and regulations



More and more concerns about ethics and Al



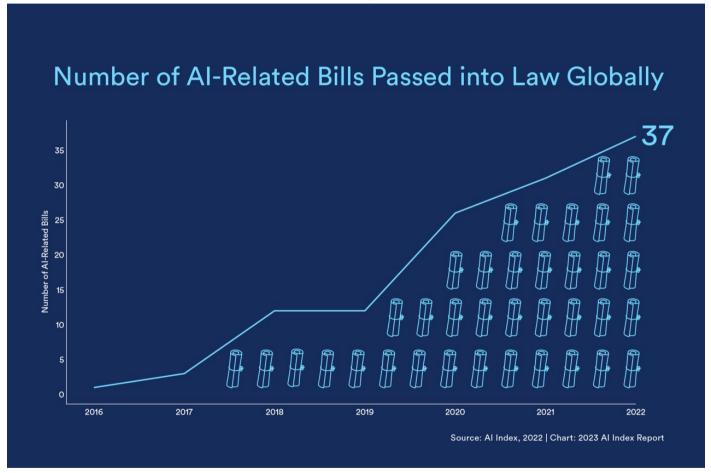


From "2023 State of AI in 14 Charts" available at https://hai.stanford.edu/news/2023-state-ai-14-charts





Al is more and more regulated



From "2023 State of AI in 14 Charts" available at https://hai.stanford.edu/news/2023-state-ai-14-charts



What Parliament wants in Al legislation

<u>Parliament's priority</u> is to make sure that AI systems used in the EU are safe, transparent, traceable, non-discriminatory and environmentally friendly. AI systems should be overseen by people, rather than by automation, to prevent harmful outcomes.

Parliament also wants to establish a technology-neutral, uniform definition for AI that could be applied to future AI systems.

Al Act: different rules for different risk levels

The new rules establish obligations for providers and users depending on the level of risk from artificial intelligence. While many AI systems pose minimal risk, they need to be assessed.

Unacceptable risk

Unacceptable risk Al systems are systems considered a threat to people and will be banned. They include:

- Cognitive behavioural manipulation of people or specific vulnerable groups: for example voice-activated toys that encourage dangerous behaviour in children
- Social scoring: classifying people based on behaviour, socio-economic status or personal characteristics
- Real-time and remote biometric identification systems, such as facial recognition

Some exceptions may be allowed: For instance, "post" remote biometric identification systems where identification occurs after a significant delay will be allowed to prosecute serious crimes but only after court approval.



High risk

Al systems that negatively affect safety or fundamental rights will be considered high risk and will be divided into two categories:

- 1) Al systems that are used in products falling under the EU's product safety legislation. This includes toys, aviation, cars, medical devices and lifts.
- 2) Al systems falling into eight specific areas that will have to be registered in an EU database:
- Biometric identification and categorisation of natural persons
- Management and operation of critical infrastructure
- Education and vocational training
- Employment, worker management and access to self-employment
- Access to and enjoyment of essential private services and public services and benefits
- Law enforcement
- Migration, asylum and border control management
- Assistance in legal interpretation and application of the law

All high-risk Al systems will be assessed before being put on the market and also throughout their lifecycle.

Generative Al

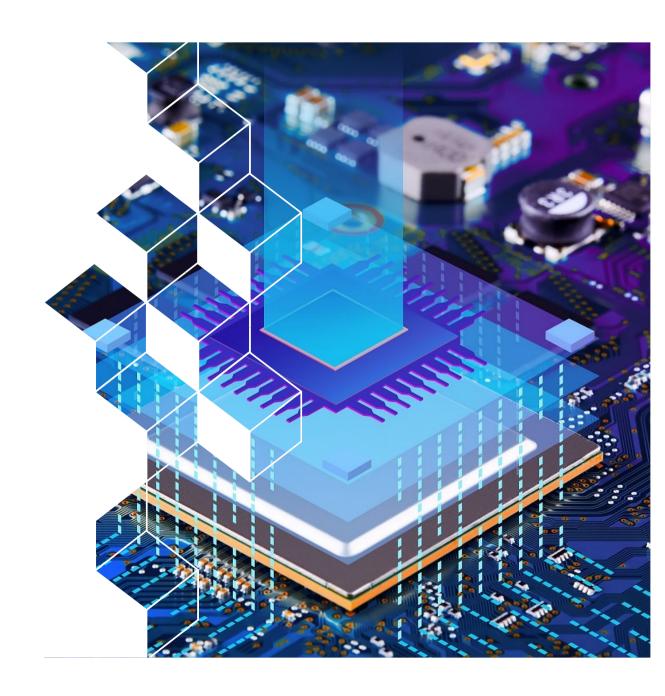
Generative AI, like ChatGPT, would have to comply with transparency requirements:

- Disclosing that the content was generated by AI
- Designing the model to prevent it from generating illegal content
- Publishing summaries of copyrighted data used for training

Limited risk

Limited risk AI systems should comply with minimal transparency requirements that would allow users to make informed decisions. After interacting with the applications, the user can then decide whether they want to continue using it. Users should be made aware when they are interacting with AI. This includes AI systems that generate or manipulate image, audio or video content, for example deepfakes.

Next steps?



Increasing the number of input tokens



What is the difference between the GPT-4 models?

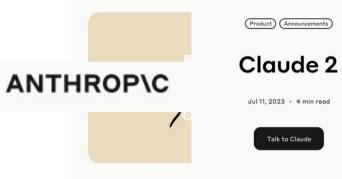


There are a few different GPT-4 models to choose from.

One key difference between models is the context length. This is the length of the prompt plue the maximum number of tekens in the completion. Our standard CPT 4 model offers 8,000 tokens for the context. We also offer an extended 32,000 token context-length model, which we are rolling out separately to the 8k model.

Secondly, gpt-4 will refer to our most up-to-date model (and gpt-4-32k for the latest 32k-context model). If you're interested in using a previous snapshot of the model, you can refer to the specific date in the model name, such as gpt-4-0314 or gpt-4-32k-0314. The March 14th snapshot will be available until June 14th.

https://help.openai.com/en/articles/7127966-what-is-the-difference-between-the-gpt-4-models



We've expanded Claude's context window from 9K to 100K tokens, corresponding to around 75,000 words!

This means businesses can now submit **hundreds of pages** of materials for Claude to digest and analyze, and conversations with Claude can go on for hours or even days.

The average person can read 100,000 tokens of text in ~5+ hours [1], and then they might need substantially longer to digest, remember, and analyze that information. Claude can now do this in less than a minute. For example, we loaded the entire text of The Great Gatsby into Claude-Instant (72K tokens) and modified one line to say Mr. Carraway was "a software engineer that works on machine learning tooling at Anthropic." When we asked the model to spot what was different, it responded with the correct answer in 22 seconds.

From https://www.anthropic.com/index/100k-context-windows



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LONGNET: Scaling Transformers to 1,000,000,000 Tokens

Jiayu Ding* Shuming Ma* Li Dong Xingxing Zhang Shaohan Huang Microsoft Research

https://aka.ms/GeneralAI

Method	Computation Complexity
Recurrent	$\mathcal{O}(Nd^2)$
Vanilla Attention	$\mathcal{O}(N^2d)$
Sparse Attention	$\mathcal{O}(N\sqrt{N}d)$
Dilated Attention (This Work)	$\mathcal{O}(Nd)$

Table 1: Comparison of computation complexity among different methods. N is the sequence length and d is the hidden dimension.

From https://arxiv.org/abs/2307.02486

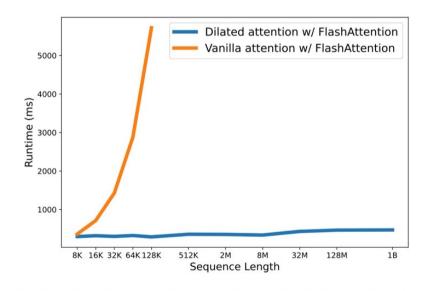


Figure 5: Runtime of our dilated attention and vanilla attention. Both are equipped with FlashAttention [DFE⁺22].

Voyager: An Open-Ended Embodied Agent with Large Language Models



Voyager is evolving in the Minecraft game, continuously explores the world, acquires diverse skills, and makes novel discoveries without human intervention.

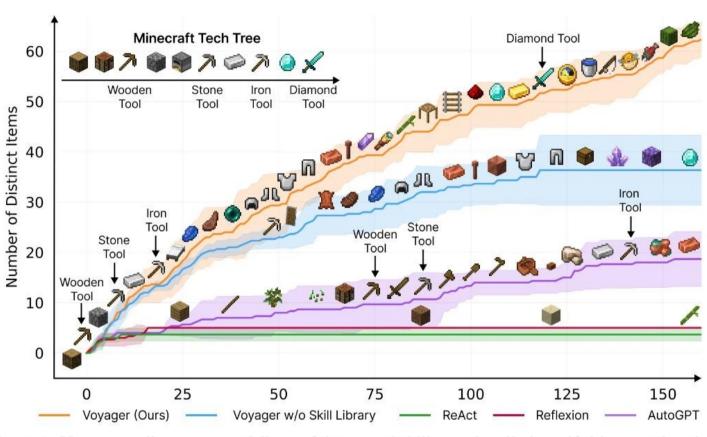


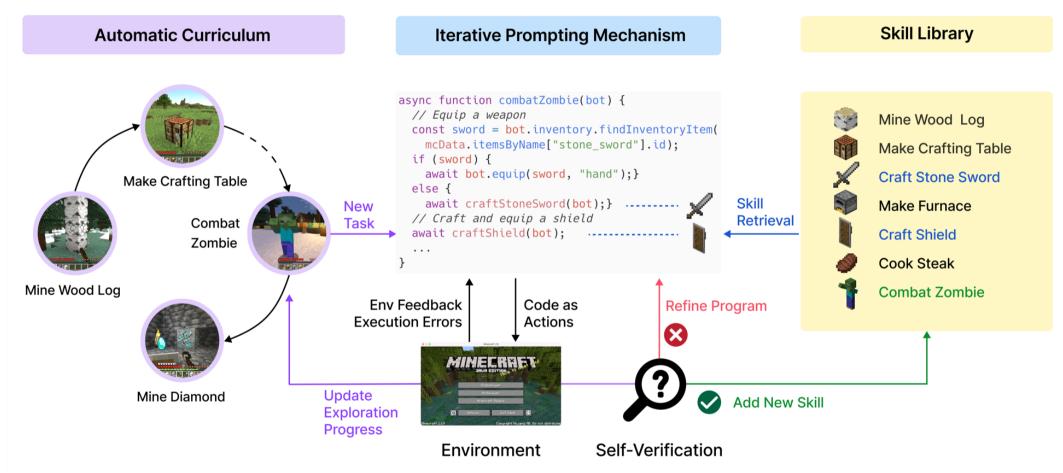
Figure 1: VOYAGER discovers new Minecraft items and skills continually by self-driven exploration, significantly outperforming the baselines. X-axis denotes the number of prompting iterations.

From: https://github.com/MineDojo/Voyager or https://voyager.minedojo.org/



Voyager: An Open-Ended Embodied Agent with Large Language Models





From: https://github.com/MineDojo/Voyager



[cs.LG] 6 Mar 2023

PaLM-E (Google)

PaLM-E: An Embodied Multimodal Language Model



Danny Driess ¹² Fei Xia ¹ Mehdi S. M. Sajjadi ³ Corey Lynch ¹ Aakanksha Chowdhery ³ Brian Ichter ¹ Ayzaan Wahid ¹ Jonathan Tompson ¹ Quan Vuong ¹ Tianhe Yu ¹ Wenlong Huang ¹ Yevgen Chebotar ¹ Pierre Sermanet ¹ Daniel Duckworth ³ Sergey Levine ¹ Vincent Vanhoucke ¹ Karol Hausman ¹ Marc Toussaint ² Klaus Greff ³ Andy Zeng ¹ Igor Mordatch ³ Pete Florence ¹

¹Robotics at Google ²TU Berlin ³Google Research

https://palm-e.github.io

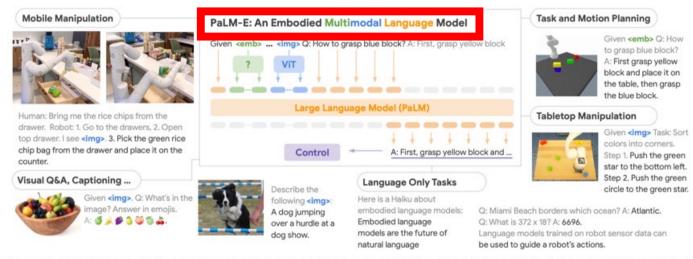


Figure 1: PaLM-E is a single general-purpose multimodal language model for embodied reasoning tasks, visual-language tasks, and language tasks. PaLM-E *transfers* knowledge from visual-language domains into embodied reasoning – from robot planning in environments with complex dynamics and physical constraints, to answering questions about the observable world. PaLM-E operates on *multimodal sentences*, i.e. sequences of tokens where inputs from arbitrary modalities (e.g. images, neural 3D representations, or states, in green and blue) are inserted alongside text tokens (in orange) as input to an LLM, trained end-to-end.

From https://palm-e.github.io/



PaLM-E: An Embodied Multimodal Language Model





Robot: I am a robot operating in a kitchen. Given **img**, When a human asks me to do a task, I will respond with the sequence of actions I would do to accomplish the task with only the items I see. Human: Use all of the ingredients you see to make a cake batter.

1. crack egg. 2. put egg in bowl. 3. put flour in bowl. 4. put sugar in bowl. 5. mix. 6. put in pan. 7. bake. 8. eat. 9. clean up.

From https://palm-e.github.io/





From https://palm-e.github.io/

How advanced is IA: LLMs and the theory of mind



Theory of Mind May Have Spontaneously Emerged in Large Language Models

Authors: Michal Kosinski*1

Affiliations:

¹Stanford University, Stanford, CA94305, USA

*Correspondence to: michalk@stanford.edu

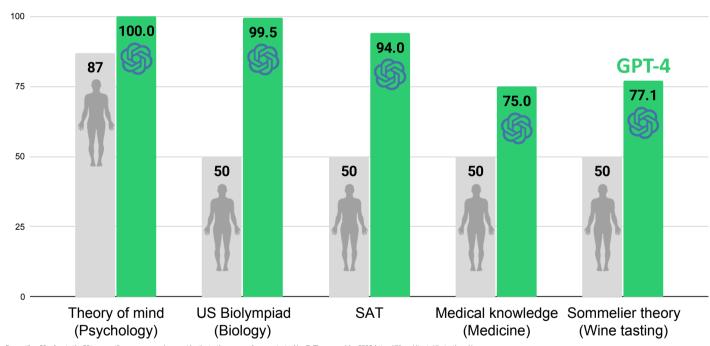
Abstract: Theory of mind (ToM), or the ability to impute unobservable mental states to others, is central to human social interactions, communication, empathy, self-consciousness, and morality. We tested several language models using 40 classic false-belief tasks widely used to test ToM in humans. The models published before 2020 showed virtually no ability to solve ToM tasks. Yet, the first version of GPT-3 ("davinci-001"), published in May 2020, solved about 40% of false-belief tasks—performance comparable with 3.5-year-old children. Its second version ("davinci-002"; January 2022) solved 70% of false-belief tasks, performance comparable with six-year-olds. Its most recent version, GPT-3.5 ("davinci-003"; November 2022), solved 90% of false-belief tasks, at the level of seven-year-olds. GPT-4 published in March 2023 solved nearly all the tasks (95%). These findings suggest that ToM-like ability (thus far considered to be uniquely human) may have spontaneously emerged as a byproduct of language models' improving language skills.

From https://www.gsb.stanford.edu/faculty-research/working-papers/theory-mind-may-have-spontaneously-emerged-large-language-models



Evolution of large Language models (LLMs)

GPT-4 VS HUMAN TESTS - SIMPLE (MAY/2023)



Selected highlights only. Percentiles; 50 refers to the 50th percentile as average, and may not be the testing average for some tests. Alan D. Thompson. May 2023. https://lifearchitect.ai/ig-testing-ai/



From Dr Alan D. Thompson, LifeArchitect.ai, https://lifearchitect.ai/iq-testing-ai/

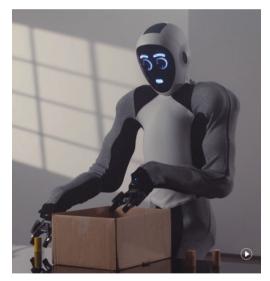


Summary

- LLMs learned the world indirectly by texts
- With multimodality, they will learn it by images and other modalities
- They are already linked to simulators ("digital twins") to experience the laws of physics (e.g. Nvidia Isaac sim)
- They will be proactive when they don't know (e.g. https://arxiv.org/abs/2307.01928)
- Next step will be that they could experience the world directly by embodiment.

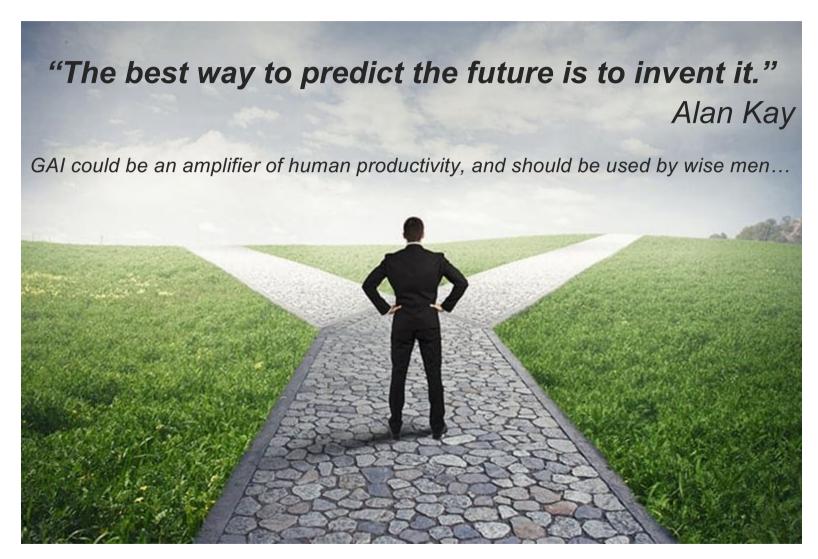


From https://www.youtube.com/watch?v=VW-dOMBFj7o



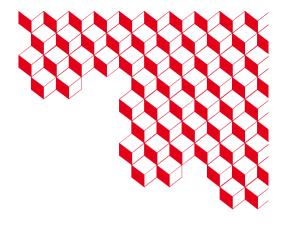
From https://www.1x.tech/

CONCLUSION: WE LIVE AN EXCITING TIME!









Thank you!

CEA

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