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Universidad del País Vasco Euskal Herriko Unibertsitatea

HiTZ

Hizkuntza Teknologiako Zentroa Basque Center for Language Technology

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German Rigau Claramunt

hitz.eus







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HAL's Legacy 2001's Computer as Dream and Reality

Edited by <u>David G. Stork</u> Foreword by <u>Arthur C. Clarke</u>

384 pp., 8 x 9 in, Paperback ISBN 9780262692113 Published: March 2, **1998** Publisher: The MIT Press



QUESTION ANSWERING SEMANTIC PARSING PROVERBS ARITHMETIC CODE COMPLETION GENERAL KNOWLEDGE READING COMPREHENSION SUMMARIZATION LOGICAL INFERENCE CHAINS COMMON-SENSE REASONING PATTERN RECOGNITION TRANSLATION DIALOGUE JOKE EXPLANATIONS PHYSICS QA LANGUAGE UNDERSTANDING

540 billion parameters

PaLM: Scaling Language Modeling with Pathways (2022) Aakanksha Chowdhery, + 67 authors

Preface

"Cuando creíamos que teníamos todas las respuestas, de pronto, cambiaron todas las preguntas."

- Mario Benedetti

"Just when we thought we had all the answers, suddenly all the questions changed."





(Brief) History of AI & NLP

1950 <u>Turing test</u>



1950 Turing test 1956 <u>DSRPAI</u>



- 1950 Turing test
- 1956 <u>DSRPAI</u>
- 1960s Rule-based AI & NLP
- 1966 <u>ALPAC</u> report



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- 1992 <u>WordNet</u>



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- 1956 <u>DSRPAI</u>
- 1960s Rule-based AI & NLP
- 1966 <u>ALPAC</u> report
- 1970s Noam Chomsky
- 1990s Statistical AI & NLP, Machine Learning
- 2010s Neural AI & NLP
 - 2013 Word Embeddings, 2017 Transformers, 2018 BERT, 2022 ChatGPT., ...
- 20XXs? AGI (singularity)



New Al paradigm

New Al paradigm

- Accelerated discovery cycle
- Impressive progress
 - **Superior** to humans in many tasks
- Deep and reinforcement learning
 - **Deep** neural networks
- Application in Language, Vision, Robotics
- Require
 - Experts, Supercomputing, Data
 - <u>LLaMA-2</u> (70B) : 1.7M GPU hours A100-80Gb (~ 1000 A100 71 days)



Deep Learning: HPC

DEEP LEARNING - A NEW COMPUTING MODEL



From Andy Steinbach (NVIDIA, 2016)

Deep Learning: HPC

In a gold rush for compute, companies build bigger than national supercomputers

"We think the most benefits will go to whoever has the biggest computer" - Greg Brockman, OpenAI CTO



Deep Learning: HPC

The rise of artificial intelligence over the last 8 decades: As training computation has increased, AI systems have become more powerful





GPT-3

chess, and shogi (Japanese chess) - all without ever being told the rules. AlexNet: 2012: 470 netaELOF A pivotal early "deep learning" system, or neural network with many layers, that could recognize images of objects such as dogs and cars at near-human level.

AlphaGo defeated 18-time c

NDI N 1 petaFLOP = 1 quadrillion FLOP Decision tree LSTM. TD-Gammon: 1992: 18 trillion FLOP 10 trillion FLOP TD-Gammon learned to play backgammon at a high level, just below the top human players of the time LeNet-5





1 billion FLOP

Shown on the vertical axis is the training computation

Computation is measured in floating point operations (FLOP).

that was used to train the AI systems.

from each grid-line to the next it shows a 100-fold increase in training computation.

10 billion petaFLOP

100 million petaFLOP The data is shown on a logarithmic scale, so that

1 million petaFLOP

10.000 petaFLOP

100 petaFLOP

 Fuzzy NN Perceptron Mark I: built in 1957/58; 695.000 FLOP Regarded as the first artificial neural network, it could visually distinguish cards marked on the left side 100.000 FLOP from those marked on the right, but it could not learn to recognize many other types of patterns. ADALINE: built in 1960 and trained on around 9,900 FLOP An early single-layer artificial neural network. 1.000 FLOP Theseus: built in 1950 and trained on around 40 floating point operations (FLOP) 10 FLOP Theseus was a small robotic mouse, developed by Claude Shannon, that could navigate a simple maze and remember its course. - Pre Deep Learning Era Deep Learning Era — Increases in training computation The first electronic computers Training computation grew in line with Moore's law, doubling roughly every 20 months. were developed in the 1940s accelerated, doubling roughly

1940 1950 1960 1970 1980 1990 2000 2010 1956: The Dartmouth workshop on AI, often 1997: Deep Blue beats world seen as the beginning of the field of AI research chess champion Garry Kasparov

https://www.visualcapitalist.co cp/charted-history-expone ntial-growth-in-ai-computati

The data on training computation is taken from Sevilla et al. (2022) - Parameter, Compute, and Data Trends in Machine Learning. It is estimated by the authors and comes with some uncertainty. The authors expect the estimates to be correct within a factor of two.

OurWorldinData.org - Research and data to make progress against the world's largest problems.

Licensed under CC-BY by the authors Charlie Giattino, Edouard Mathieu, and Max Roser

2020

Volume of data/information created, captured, copied, and consumed worldwide from 2010 to 2020, with forecasts from 2021 to 2025 (in zettabytes)



https://www.statista.com/statistics/871513/worldwide-data-created/

Every minute of the day in Internet 2022 ...



https://localiq.com/blog/what-happens-in-an-internet-minute/

Information overload infobesity, infoxication!



Information overload infobesity, infoxication! by Bertram Gross, <u>The Managing of</u> <u>Organizations: The administrative</u> <u>struggle</u> (1964)

POLDAR

The MANAGING of ORGANIZATIONS

THE ADDIVITIATION CONCLUS

HERTEAN AT GROSS

Die Nes Pers of Education

- Information overload infobesity, infoxication! by Bertram Gross, *The Managing of* Organizations: The administrative <u>struggle</u> (1964)
- by Alvin Toffler, *Future Shock* (1970)



- Information overload
- infobesity, infoxication!
- by Bertram Gross, <u>The Managing of Organizations: The</u> <u>administrative struggle</u> (1964) by Alvin Toffler, Future Shock (1970)
- Seneca complained that "the abundance of books is distraction" in the 1st century AD!



INFORMATION IS POWER

KNOWLEDGE IS POWER



Figure 5. Example alignments predicted by our model. For every test image above, we retrieve the most compatible test sentence and visualize the highest-scoring region for each word (before MRF smoothing described in Section 3.1.4) and the associated scores $(v_i^T s_t)$. We hide the alignments of low-scoring words to reduce clutter. We assign each region an arbitrary color.

Deep visual-semantic alignments for generating image descriptions (2014) A Karpathy, L Fei-Fei



LipNet: Sentence Level Lipreading (2016) Yannis M. Assael, Brendan Shillingford, Shimon Whiteson, Nando de Freitas

A Style-Based Generator Architecture for Generative Adversarial Networks (2018) Tero Karras, Samuli Laine, Timo Aila https://thispersondoesnotexist.com



Figure 2. Uncurated set of images produced by our style-based generator (config F) with the FFHQ dataset. Here we used a variation of the truncation trick [40, 5, 32] with $\psi = 0.7$ for resolutions $4^2 - 32^2$. Please see the accompanying video for more results.

Recursively Summarizing Books with Human Feedback (2021) Jeff Wu, Long Ouyang, Daniel M. Ziegler,

Nisan Stiennon, Ryan Lowe, Jan Leike, Paul Christiano

Alice's Adventures in Wonderland





Zero-Shot Text-to-Image Generation

(2021) Aditya Ramesh, Mikhail Pavlov, Gabriel Goh, Scott Gray, Chelsea Voss, Alec Radford, Mark Chen, Ilya Sutskever https://openai.com/blog/dall-e/

an illustration of a baby daikon radish in a tutu walking a dog



Edit prompt or view more images +

an armchair in the shape of an avocado [...]

AI-GENERATED IMAGES

TEXT PROMPT



Edit prompt or view more images +

TEXT PROMPT

a store front that has the word 'openai' written on it [...]

AI-GENERATED IMAGES



Edit prompt or view more images +

DALL-E 2 Midjourney Stable Diffusion

• • •

Deep Learning: pictures and video



v3 August 22

v4 November 22

v5 Mach 23

https://arstechnica.com/information-technology/2023/03/ai-imager-midjourneyv5-stuns-with-photorealistic-images-and-5-fingered-hands/

Deep Learning: music, speech

MusicLM: Generating Music From Text (2023) 13 authors

MusicLM Elevenlabs Whisper PromptTT2

- - k



NO

TIMESTAMPS

text tokens

Text-only transcription

(allows dataset-specific fine-tuning)

TRANSLATE

X → English

Translation

NO

SPEECH

Voice activity

detection

(VAD)

Custom vocabulary /

timestamp

tokens

text

tokens

special

tokens

Deep Learning: coding, programming

Evaluating Large Language Models Trained on Code (2021) 58 authors

<u>Codex</u> <u>Copilot</u> <u>Codewhisperer</u> <u>ChatGPT</u>

. . .

🛃 course.rb Js time.is 🗝 runtime.go 1 package main 3 type Run struct { Time int // in milliseconds Results string Failed bool 7 } var totalTime int var failedRuns int for _, run := range runs { if run.Failed { failedRuns++ } else { totalTime += run.Time averageRuntime := float64(totalTime) / float64(len(runs) - failedRuns) / 1000 return averageRuntime

Deep Learning: coding, programming

Code as Policies: Language Model Programs for Embodied Control (2022)8 authors



Deep Learning: 3D objects

DreamFusion: Text-to-3D using 2D Diffusion (2022) 4 authors POINT-E Magic3D . . .



Deep Learning: videos

<u>Make-A-Video: Text-to-Video</u> <u>Generation without Text-Video Data</u> (2022)

Uriel Singer, Adam Polyak, Thomas Hayes, Xi Yin, Jie An, Songyang Zhang, Qiyuan Hu, Harry Yang, Oron Ashual, Oran Gafni, Devi Parikh, Sonal Gupta, Yaniv Taigman

Make-a-video VEED.IO GliaStudio Sora (video)

. . .



Deep Learning: language

We Prompted ChatGPT to be a Translation Manager Additionally, there can be cultural MORE VIDEOS differences between languages 1:39 / 4:25 YouTube []

Example of using <u>ChatGPT</u>, <u>Synthesia</u> and <u>Descript</u>. <u>https://slator.com/we-prompted-chatgpt-to-be-a-translation-manager/</u>

Deep Learning: multimodal

Language Is Not All You Need: Aligning Perception with Language Models (2023) 14 authors Kosmos-1 Unified-IO 2

- 4 -



Deep Learning: dubbing



Example of translating, dubbing and changing facial expressions by HeyGen

Deep Learning: robotics



Atlas from Boston Dynamics

Language-centered Al

Al overview

- AI techniques/methods: ML, DL, RL, etc.
- Functional applications:
 - Language Technology
 - \circ vision
 - \circ robotics
 - Data Science
- Fields of application:
 - Health, public administrations, tourism, internet, technological surveillance, security, etc.



Language Technology

>80% unstructured digital information

Text (multilingual), audio, video

Natural Language Processing is the area of Artificial Intelligence that deals with written and spoken (or sign) language

- Automatic Translation
- Extraction and Recovery of information
- Speech Recognition and Synthesis
- Conversational systems (chatbots)



Explaining a joke

Prompt

Explain this joke:

Joke: Did you see that Google just hired an eloquent whale for their TPU team? It showed them how to communicate between two different pods!

Model Response

Prediction: TPUs are a type of computer chip that Google uses for deep learning. A "pod" is a group of TPUs. A "pod" is also a group of whales. The joke is that the whale is able to communicate between two groups of whales, but the speaker is pretending that the whale is able to communicate between two groups of TPUs.

PaLM explains an original joke with two-shot prompts.

PaLM: Scaling Language Modeling with Pathways (2022) Aakanksha Chowdhery, + 67 authors Experts, Data, HPC

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LOGICAL INFERENCE CHAINS COMMON-SENSE REASONING PATTERN RECOGNITION TRANSLATION DIALOGUE JOKE EXPLANATIONS PHYSICS QA LANGUAGE UNDERSTANDING

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 Experts, Data, HPC

LANGUAGE MODEL SIZES TO MAR/2023



Scherchitect.ai/models

https://lifearchitect.ai/models/





Scherchitect.ai/models

https://lifearchitect.ai/models/

LARGE LANGUAGE MODEL HIGHLIGHTS (FEB/2024)



Sizes linear to scale. Selected highlights only. All models are available. All models are Chinchilla-aligned (20:1 tokens:parameters) https://lifearchitect.ai/chinchilla/ All 200+ models: https://lifearchitect.ai/models-table/ Alan D. Thompson. 2023-2024.

S LifeArchitect.ai/models

ttps://lifearchitect.ai/models/



https://yaofu.notion.site/How-does-GPT-Obtain-its-Ability-Tracing-Emergent-Abilitiesof-Language-Models-to-their-Sources-b9a57ac0fcf74f30a1ab9e3e36fa1dc1

LLMs: Zero-shot



LLMs: few-shot



Multimodal Large Language Model (MLLM)



Question: what did WALL-E give EVE? Answer: potted plant



Question: What's in WALL-E's hand? Answer:

Rubik's Cube



Image



Image

(b) Few-shot learning

Language Agents



DLE Metric: Technological Scores



European Language Equality

FURODEAN

LANGUAGE



Some reports



Reports AI & LT

- The Al index
- <u>State of Al</u>
- <u>Al watch</u>
- <u>OECD.AI</u>
- European Language Equality





Summary

Summary

- Unthinkable AI applications just a few years ago
- Even more **amazing** results in the near future (day by day)
- Experts, Supercomputing, Data ...
- Resources (funding) Experts, Supercomputing, **Data** ... **Coordination** and cooperation (EU, national, regional)
- - Administration, academia, technology centers, companies Ó

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