

The Role of Generative Al in Academic Research

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Agenda

- Introduction to Generative AI
- Generative AI in Research
- Collaborative between Academia and Industry
- Responsible AI for Research



Introduction to Generative AI



What is Generative AI?





Algorithms and models capable of generating new data that resembles a given dataset.

To create diverse, realistic, and highquality data



Generated Data type Text Image Audio Video

AI Text Generation: ChatGPT

- Based on GPT (Generative Pre-trained Transformer) 3.5/4 Model
 - · OpenAl
 - Released at 2022.11.30

ChatGPT: Optimizing Language Models for Dialogue

We've trained a model called ChatGPT which interacts in a conversational way. The dialogue format makes it possible for ChatGPT to answer followup questions, admit its mistakes, challenge incorrect premises, and reject inappropriate requests. ChatGPT is a sibling model to <u>InstructGPT</u>, which is trained to follow an instruction in a prompt and provide a detailed response.

TRY CHATGPT A



November 30, 2022 13 minute read

https://openai.com/blog/chatgpt

AI Image Generation





The Evolution of Al Paradigms

- The Core of AI Technology
 - Models: mathematical frameworks or computational systems that are trained on data to perform tasks such as making predictions, identifying patterns, or making decisions
 - Model = $f_{algorithm}(Data)$
- Al Paradigm
 - #1: Training from scratch
 - #2: Pretrained model + fine tuning
 - #3: Pretrained large model + prompt engineering

Training From Scratch





Pretrained Large Model + Prompt Engineering



Examples of Generative Models



Generative Pre-trained Transformer (GPT) Architecture: Transformer-based model for natural language processing. Real-world application examples

Diffusion Models

Probabilistic generative model for data generation.

Real-world application examples



Fully connected neural network (FCNN)



Self-Attention

b¹

- Computing the similarity between each element and other elements in the input sequence as weights
- The model can capture long-distance dependencies in the sequence, not just the local information



Matrix Operations of Self-attention



Transformer: Seq2seq model with Self-Attention



Text Generation



- Input: token sequence
- Output: the next token (word) to the sequence

GPT (Generative Pre-trained Transformer)

to school ... Transformer Decoder Unidirectional attention Transformer Decoder

Attention-based deep transformers







Attention



Diffusion Model: Generate Images from Noise













step 1



Denoise => Predict noise



Math principals of diffusion model

Algorithm 1 Training	Algorithm 2 Sampling	
1: repeat 2: $\mathbf{x}_0 \sim q(\mathbf{x}_0)$ 3: $t \sim \text{Uniform}(\{1, \dots, T\})$ 4: $\boldsymbol{\epsilon} \sim \mathcal{N}(0, \mathbf{I})$ 5: Take gradient descent step on $\nabla_{\theta} \ \boldsymbol{\epsilon} - \boldsymbol{\epsilon}_{\theta} (\sqrt{\bar{\alpha}_t} \mathbf{x}_0 + \sqrt{1 - \bar{\alpha}_t} \boldsymbol{\epsilon}, t) \ ^2$ 6: until converged	1: $\mathbf{x}_T \sim \mathcal{N}(0, \mathbf{I})$ 2: for $t = T,, 1$ do 3: $\mathbf{z} \sim \mathcal{N}(0, \mathbf{I})$ if $t > 1$, else $\mathbf{z} = 0$ 4: $\mathbf{x}_{t-1} = \frac{1}{\sqrt{\alpha_t}} \left(\mathbf{x}_t - \frac{1-\alpha_t}{\sqrt{1-\bar{\alpha}_t}} \boldsymbol{\epsilon}_{\theta}(\mathbf{x}_t, t) \right) + \sigma_t \mathbf{z}$ 5: end for 6: return \mathbf{x}_0	

Denoising Diffusion Probabilistic Models

Submitted on 19 Jun 2020, last revised 16 Dec 2020 [2006.11239] Denoising Diffusion Probabilistic Models (arxiv.org)

The Spread of Prompt Engineering



- Prompt Engineering
 - a method to enhancing model performance by crafting effective prompts
 - the process of carefully crafting and refining input prompts to guide machine learning models, particularly language models, towards producing desired outputs
- The Revolution of AI adoption
 - Input with natural language instead of code
 - AI models are accessible for unprofessional users
 - Prompts are description of user's requirements

Generative Al in Research



Generative AI aids in academic reading

- Automated Abstraction
- Automated summarization
- Knowledge extraction
- The dominant sequence transduction models are based on complex recurrent or convolutional neural networks that include an encoder and a decoder. The best performing models also connect the encoder and decoder through an attention mechanism. 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. Our model **achieves** 28.4 BLEU on the WMT 2014 English to-German translation task, improving over the existing best results, including ensembles, by over 2 BLEU. 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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Abstract

The dominant sequence transduction models are based on complex recurrent or convolutional neural networks that include an encoder and a decoder. The best performing models also connect the encoder and decoder through an attention mechanism. 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. Our model achieves 28.4 BLEU on the WMT 2014 Englishto-German translation task, improving over the existing best results, including ensembles, by over 2 BLEU. 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.

An academic assistant aids in paper reading

- Basic Information
- Paper Structure
- Key points
- Related information

Structure of "Attention is all your need"

- 1. Introduction
- 2. Background
- 3. Model Architecture
 - 3.1 Transformer Architecture3.2 Attention
- 4. Why Self-Attention
- 5. Training

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- 6. Results
- 7. Conclusion

Automated Literature Review

- Utilizing AI to streamline the literature review process
- Al-powered tools for literature review
 - Time-saving
 - comprehensive analysis
 - bias reduction

SCISPACE		
Quid	ck tips for writing	ga /IEW
0	×	
Pick an accessible topic	Research your topic	Read and take notes diligently
-02-	0.2	
Create a rough structure	Turn your notes into the first draft	Edit and proofread



Automated Hypothesis Generation

- Leveraging AI to formulate research hypotheses
 - AI-driven tools analyze vast literature using NLP
 - Identify connections across research areas
- Generate innovative hypotheses
 - Data analytics to discover new patterns or relations
 - Beyond traditional methods



Figure 1. a) A systematic diagram of using ChatGPT as a hypothesis machine to achieve scientific innovations. ChatGPT's creativity is used to derive new hypotheses from existing literature. Then generated hypotheses are curated, tested and accepted. b) The scenario of AI-generated hypothesis generation, human curating, automated experimentation, and adversarial peer reviews. It may become a multi-agent swarm effort with built-in diversity of hyperparameters in an evolutionary setting.

Data Augmentation & Synthetic Data Generation

- Data Augmentation
 - Transformations (rotation, flipping, cropping) to diversify dataset
 - Common in image tasks.
- Synthetic Data Generation
 - Create new data points via algorithms
 - Addresses data scarcity and aids when labeling is challenging.
- Expanding datasets through synthetic data generation
- Enhance training data quality & quantity



Prewrite & Draft Academic Papers

- Prewriting
 - Expand on your research questions with an AI brainstorming session
 - Turn your ideas into an outline with an AI outline generator
- Drafting
 - Streamline the writing process with an AI-powered content generator by offering personalized content that reflects your varied sources and ideas

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are backed by round-the-clock support:	Auto-savings, Fee-free, 24/7 support	
Auto-savings: Our app takes the		
process. Set your savings goals and		
watch as the app intelligently saves for		
you, helping you reach your financial		
Fee-free: Say goodbye to unnecessary		
fees. Our app is completely fee-free,		

assistant by scite Beta	Install extension! Pr
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	• Fact-checking my answer to make sure it is correct, hang on (1/11) Controversions in the field of nephrology encompass a range of topics that are still subject to intense debate and differing opinions within the nephrology community. One area of controversy is the definition and classification of chronic king because interversies conference to address this issue and develop a global consensus [1].
	Another controversial topic is the management of kidney disease in patients with hematological malignancies and the burden of cancer after kidney transplantation. The KDIGO Controversies Conference on onco-nephrology focused on
	The use of intravenous iron products in patients with end-stage renal disease (ESRD) and inflammatory bowel disease (IBD) is also a subject of controversy. The chronic indiscriminate use of these products can lead to iron overload, and with this practice is still debated within the nephrology community [3].
	Preservation of residual renal function (RRF) in dialysis patients is another area of controversy. While there are attempts to preserve RRF in patients with Stage 5 CKD, there are differing opinions on the benefits and drawbacks of this app
	The evaluation and management of vitamin D deficiency in nephrology is also a topic of controversy. Guidelines and recommendations vary, and there is ongoing debate about the optimal approach to addressing vitamin D deficiency in [6].
	Other controversial topics in nephrology include the use of angiotensin receptor antagonists and angiotensin-converting enzyme inhibitors in the treatment of kidney disease, the role of estimated glomerular filtration rate in live kidney d evidence-based approach to the treatment of chronic kidney disease-mineral and bone disorder [7][8][9].
	Overall, controversies in nephrology arise from the complexity of the field and the ongoing research and advancements in understanding kidney diseases and their management. These controversies highlight the need for continued rese and discussion within the nephrology community to improve patient outcomes and guide clinical practice.
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	(2019). doi:10.1016/j.bityo.2019.e02045 (2) Bover et al., "Siddows in thematic kildery disease: - mineral and bove disorder guidelines: is it time to text or time to wait? Clinical kidery journal (2020). doi:10.1016/j.j.dit187 (3) Liney et al., "Dothinitian and classification at disorder guidelines: in it time to text or time to wait? Clinical kidery journal (3) Liney et al., "Dothinitian and classification at disorder guidelines: in time to the COD-treatment working goop of the Tatalian Society of (4) Buildzi et al., "Residual renal function and dislayis modulity: is it really bownicing". (5) Canasid et al., "Residual renal function and dislayis modulity: is it really bownicing".

 Utilizing AI to mentor and guide junior researchers, especially through chat-based interactions

• Benefits

- Enhanced learning
- Personalized feedback
- Accelerated research progress

Junior Researchers Coaching

Collaborative Detween Acadedicina & INDUSTRY Opportunities between Industry and Academia



Benefits of Collaboration

- Knowledge Exchange
 - Sharing expertise and resources for mutual growth.
- Talent Development
 - Training the next generation of AI researchers and practitioners.
- Problem-Solving
 - Tackling real-world challenges with combined efforts.



Areas for Collaboration (1)

- Joint Research Projects
 - Initiatives in the realm of Generative AI
 - Driven by requirements from industry
- Product Development
 - Academic guidance from academia (e.g. algorithms, prompts)
 - Collect feedback from customers directly

Areas for Collaboration (2)

- Educational Programs
 - Co-developed courses, workshops, and training programs
 - Public lectures and knowledge sharing
- Community Engagements
 - Hackathons
 - Competitions
 - Fostering an ecosystem





Responsible AI for Research



Bias and Fairness

- Biases in AI models
- Principle: Ensuring fairness and avoiding discrimination.
- Strategies
 - Bias detection
 - fairness-aware algorithms
 - diverse data collection.

Data Privacy

- Ethical handling of data, especially in sensitive research areas to protect individuals' data and ensuring privacy compliance
- Strategies
 - Privacy-preserving data augmentation
 - differential privacy

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Accountability and Transparency

- Build trust and understanding among stakeholders by Ensuring clarity and openness in AI systems and research processes.
- Strategies
 - Transparent reporting
 - open-source models
 - explainable AI





Thank you

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