ChatGPT meets Wireless:

What will ChatGPT bring to wireless communications?

Jun Zhang



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Outline

- A primer on ChatGPT
- ChatGPT for Wireless
- Wireless for ChatGPT
- Takeaways

A primer on ChatGPT

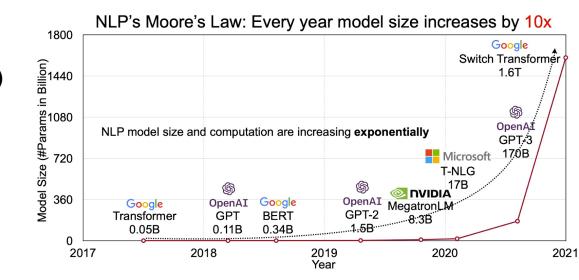
What is ChatGPT? What can it do?

Terminology: What are LLM, GPT, AIGC, ChatGPT?

- LLM (Large Language Model)
 - Trained by large-scale data on the Internet (10~100TB)
 - A huge number of parameters (billion level)
- GPT (Generative Pre-trained Transformer)
 - 0.1 B (GPT-1) to ~200 B parameters (GPT-3)
 - In-context learning without fine-tuning
- AIGC (Al Generated Content)
 - Image (Stable Diffusion, DALL-E 2, etc.)
 - Text (ChatGPT)

ChatGPT

- A combination of cutting-edge NLP techniques:
 - Code pre-training + Instruction tuning + Reinforcement learning from human feedback (RLHF)

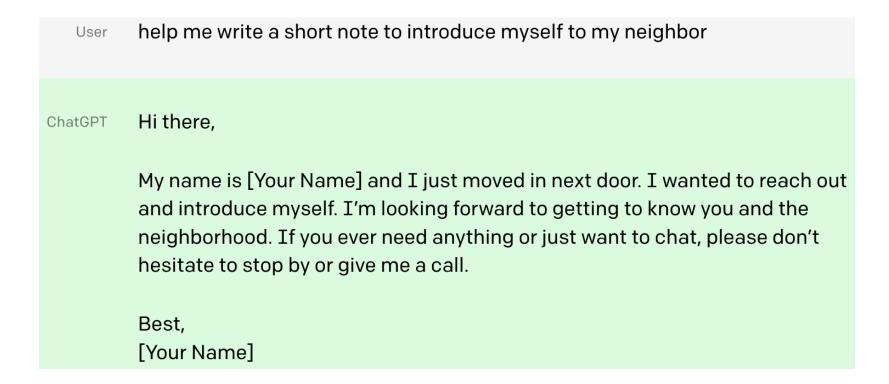






ChatGPT Examples

Assist writing and editing.



ChatGPT Examples

• Maintain the context of the on-going conversation.

User	can you make it more formal?
ChatGPT	Dear Neighbor,
	I am writing to introduce myself. My name is [Your Name] and I have recently moved in next door. I wanted to take a moment to reach out and say hello. I am looking forward to getting to know you and the neighborhood.
	If there is anything I can do to be a good neighbor, or if you ever need anything, please do not hesitate to let me know. I am happy to help in any way that I can.
	Sincerely, [Your Name]

ChatGPT Examples

Aware of its own capability.

User	can you send it for me?
ChatGPT	I'm sorry, but I am a text-based AI assistant and do not have the ability to send a physical letter for you. I can only provide suggestions and advice on what to write. It is up to you to take that advice and send the letter yourself.

Training ChatGPT – InstructGPT

Step I: supervised fine-tuning

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-3.5 with supervised learning.



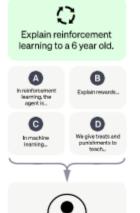
Explain reinforcement

Step 2: reward modeling

Step 2

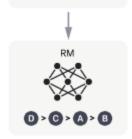
Collect comparison data and train a reward model.

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.



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Training language models to follow instructions with human feedback

Step 3: reinforcement learning

Step 3

Optimize a policy against the reward model using the PPO reinforcement learning algorithm.

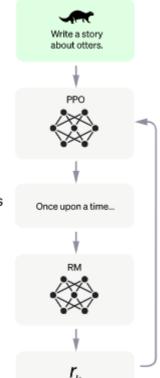
A new prompt is sampled from the dataset.

The PPO model is initialized from the supervised policy.

The policy generates an output.

The reward model calculates a reward for the output.

The reward is used to update the policy using PPO.

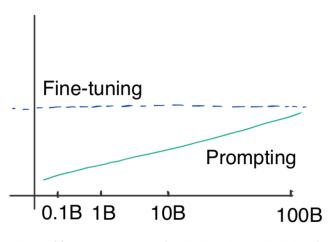


Key enablers of ChatGPT

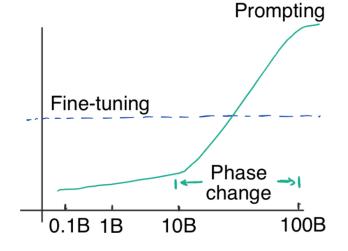
- Super computing resource
 - Microsoft Azure



- Emergent ability of large language model breaks the scaling law
 - Automatically capture different kinds of context information in a forward pass



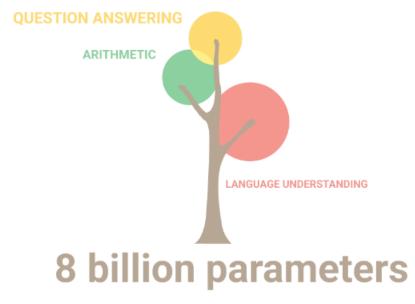
Scaling Law (~2020 - 2021)



Emergent Ability (from early 2022)

Emergent abilities of LLMs

As the scale of the model increases, the performance improves across tasks while also unlocking new capabilities.



https://ai.googleblog.com/2022/04/pathways-language-model-palm-scaling-to.html?ref=news-tutorials-ai-research

What ChatGPT can do?

Generalization

• Generate responses that match the user's intent with multiple turns.

Creativity

• Strong performance in creative writing tasks, and can even polish its writing step by step.

Correction

Can actively admit its own mistakes.

Safety

 Good at rejecting unsafe questions or generating safe responses with the consideration of ethical and political factors.

What ChatGPT cannot do?

Modality

• Limit to text generation.

Logic reasoning

• Cannot effectively deal with accurate logic problems (e.g., simple math).

Reliability

• May generate factually incorrect or biased responses.

Knowledge learning

• Cannot search from the website in real time to learn new knowledge and up-to-date information.

Robustness

 Vulnerable to attacks, including instruction attack (making the model follow a wrong instruction to do something illegal or unethical) and prompt injection.

ChatGPT is revolutionizing different application areas

- Question answerer
- Language translator
- Help search engine
- Polish writing
- Hints for brainstorming and creativity
- Education (as a human mentor)
- Entertainment (e.g., story generation)
- ...



ChatGPT for Wireless Communication

ChatGPT-enabled techniques

What does ChatGPT say?

Prompts

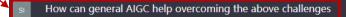
can you summarize some of the challenges in wireless communications



Certainly! Some of the challenges in wireless communications include:

- 1. <u>Limited spectrum availability</u>: The radio frequency spectrum that wireless communication systems rely on is limited, which can cause congestion and make it difficult to allocate sufficient bandwidth to all users.
- 2. Interference: Wireless communication systems are susceptible to interference from other devices operating on the same frequency, as well as physical obstructions like buildings and trees.
- 3. <u>Signal degradation</u>: Wireless signals can be weakened by distance, atmospheric conditions, and other factors, which can result in dropped calls, slow data transfer rates, and other performance issues.
- 4. Security: Wireless communication systems are vulnerable to a range of security threats, including unauthorized access, eavesdropping, and denial of service attacks.
- 5. Battery life: Many wireless devices are battery-powered, and optimizing battery life can be a challenge, especially for devices that require constant connectivity or frequent data transmission.
- 6. <u>Cost:</u> Building and maintaining wireless communication infrastructure can be expensive, especially in rural or remote areas with limited resources.
- Regulatory compliance: Wireless communication systems are subject to a range of regulations and standards, which can be complex and vary by jurisdiction.

These challenges require ongoing research and development efforts to improve wireless communication systems and ensure that they meet the needs of users in a variety of settings.





General artificial intelligence generated content (AIGC) can help overcome some of the challenges in wireless communications in the following ways:

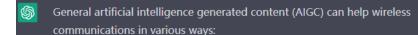
- Limited spectrum availability: AIGC can be used to optimize spectrum usage by analyzing network traffic and dynamically allocating bandwidth based on demand, which can help reduce congestion and improve overall network performance.
- Interference: AIGC can be used to identify sources of interference and dynamically
 adjust wireless settings to avoid or mitigate interference, which can help improve
 signal quality and reduce dropped calls.
- 3. Signal degradation: AIGC can be used to optimize wireless signal strength by analyzing environmental factors and adjusting transmission parameters, which can help improve overall network performance and reduce the impact of signal degradation.
- 4. Security: AIGC can be used to detect and respond to security threats in real-time by analyzing network traffic for patterns that indicate unauthorized access or other security breaches.
- 5. Battery life: AIGC can be used to optimize device settings and network configurations to reduce power consumption and improve battery life, which can help extend the operating time of wireless devices.
- Cost: AIGC can be used to optimize network design and infrastructure
 deployment by analyzing data on user demand, network topology, and other
 factors, which can help reduce costs and improve overall network efficiency.
- Regulatory compliance: AIGC can be used to ensure compliance with regulatory requirements and industry standards by monitoring network performance and identifying areas where improvements are needed.

Overall, AIGC has the potential to significantly improve the performance, efficiency, and security of wireless communication systems, helping to overcome many of the challenges that currently exist in this field.



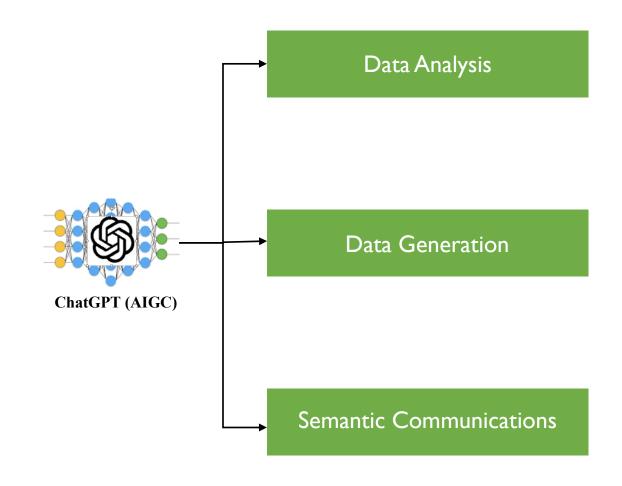
How can ChatGPT/AIGC help wireless?

How can general artificial intelligence generated content (AIGC) help wireless communications

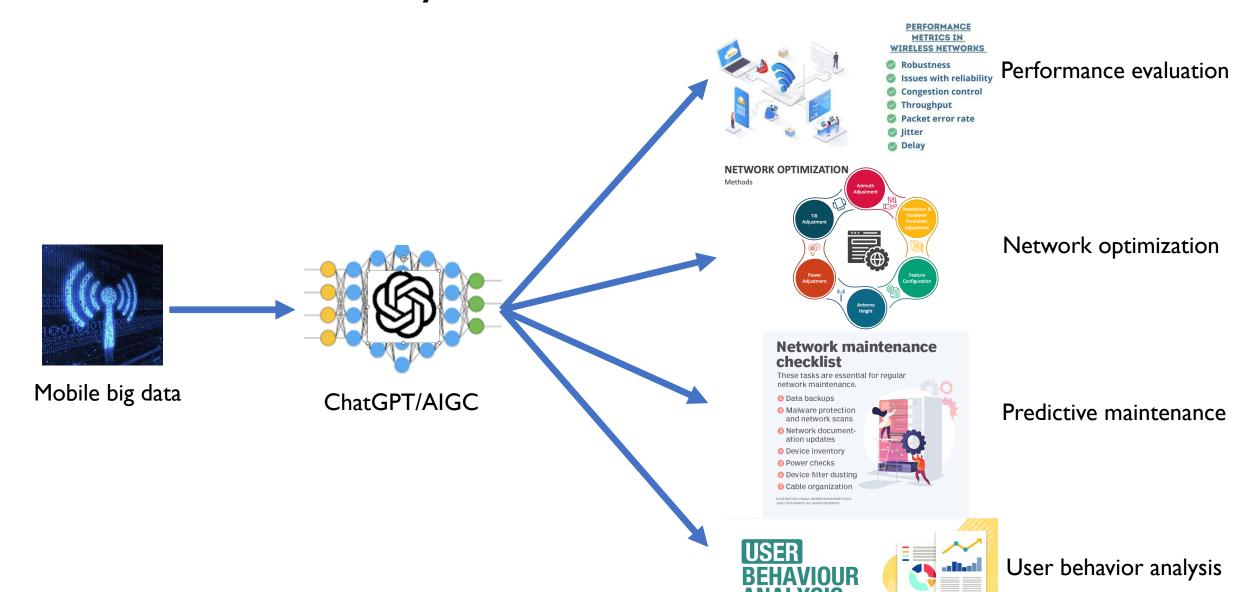


- Enhance network performance: AIGC can be used to optimize the performance of wireless networks by analyzing data on network traffic, signal strength, and other factors. This can lead to faster data transfer rates, fewer dropped calls, and better overall network reliability.
- 2. Predictive maintenance: AIGC can be used to predict maintenance needs of wireless communication systems by analyzing performance data and identifying trends that may lead to future problems. This can help network operators proactively address issues before they result in downtime or other negative impacts.
- 3. Real-time network management: AIGC can be used to analyze real-time data from wireless communication systems and make decisions on network management, such as adjusting power levels or routing traffic to minimize congestion.
- 4. Enhanced security: AIGC can be used to detect and prevent security breaches in wireless communication systems by analyzing network traffic and identifying anomalies that may indicate unauthorized access or other security threats.
- 5. Intelligent antenna systems: AIGC can be used to optimize the performance of antenna systems by analyzing data on signal strength, interference, and other factors. This can lead to better coverage and stronger signals, especially in areas with high levels of interference.

Overall, AIGC can greatly improve the performance, efficiency, and security of wireless communication systems, making them an important tool for network operators and other stakeholders in the wireless industry.



Use case: Data analysis

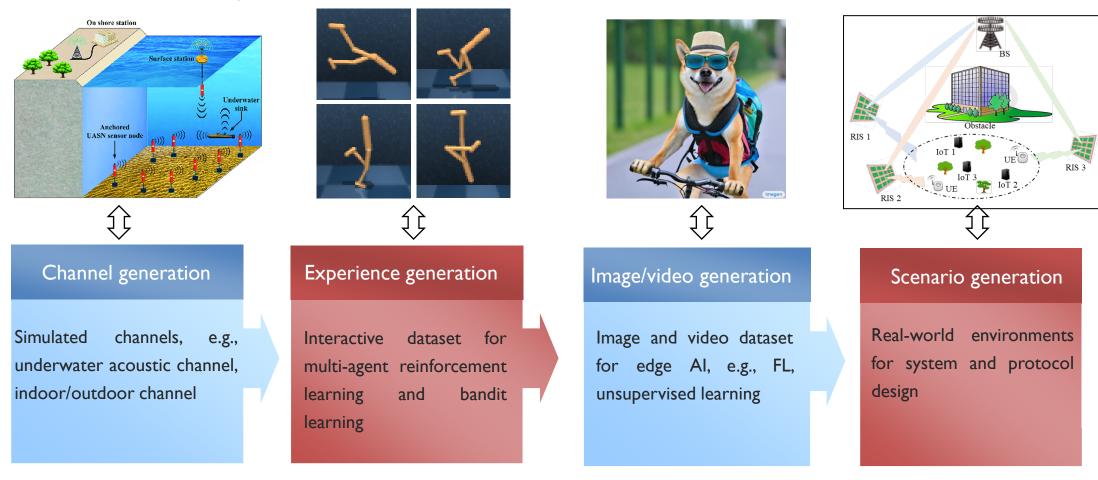


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data and activities using monitoring systems.

Use case: Data generation

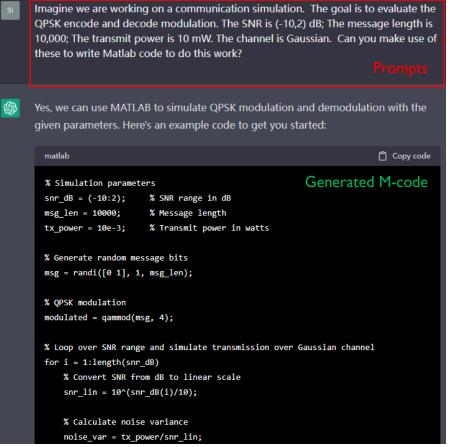
> Use ChatGPT to generate various data for communication simulations



https://arxiv.org/abs/2211.13350

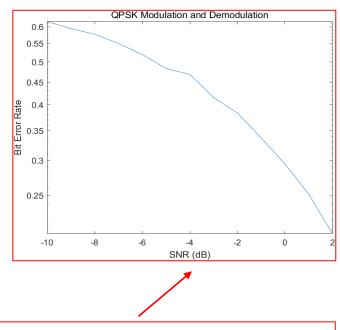
Example: Code generation for simulations (QPSK evaluation)

> Use ChatGPT to generate the Matlab code for performance evaluation of QPSK modulation



```
% Add Gaussian noise to the modulated signal
     received = awgn(modulated, snr dB(i), 'measured');
     % OPSK demodulation
                                                          AWGN channel
     demodulated = qamdemod(received, 4);
     % Calculate bit error rate (BER)
     ber(i) = sum(msg ~= demodulated)/msg len;
  end
  % Plot BER vs SNR curve
  semilogy(snr dB, ber);
  xlabel('SNR (dB)');
  ylabel('Bit Error Rate');
  title('QPSK Modulation and Demodulation');
                                                          Task explanation
This code generates a random message of length `msg_len`, modulates it using QPSK
modulation, and simulates transmission over a Gaussian channel with different SNR
values. For each SNR value, it calculates the noise variance based on the transmit
power and SNR, adds Gaussian noise to the modulated signal, demodulates the
received signal using QPSK demodulation, and calculates the bit error rate (BER)
between the original message and the demodulated message. Finally, it plots the
BER vs SNR curve using a logarithmic scale on the y-axis. Note that the transmit
power in this simulation is higher than in the previous example, which may result in a
better BER performance at higher SNR values.
```

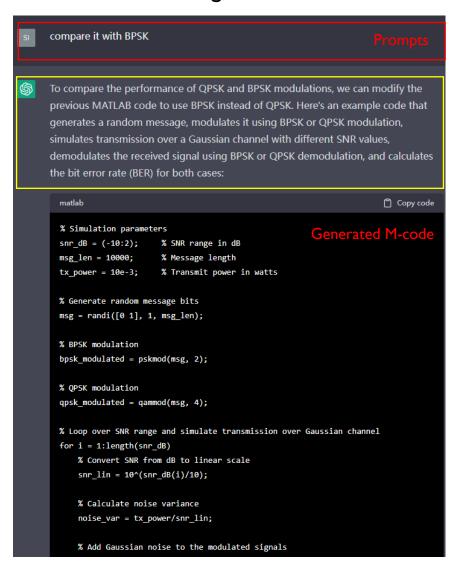
Result is reasonable



This result is obtained by directly running the above M-code in Matlab without any modification.

Example: Code generation for simulations (BPSK vs. QPSK)

> Use ChatGPT to generate the Matlab code to compare the performance of QPSK and BPSK modulations

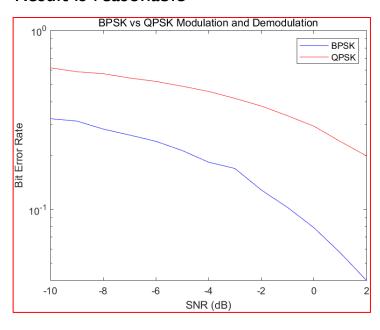


```
% Add Gaussian noise to the modulated signals
     bpsk received = awgn(bpsk modulated, snr dB(i), 'measured');
     qpsk_received = awgn(qpsk_modulated, snr_dB(i), 'measured');
     % BPSK demodulation
     bpsk demodulated = pskdemod(bpsk received, 2);
     % OPSK demodulation
     qpsk demodulated = qamdemod(qpsk received, 4);
     % Calculate bit error rate (BER) for BPSK and OPSK
     bpsk_ber(i) = sum(msg ~= bpsk_demodulated)/msg len;
     qpsk_ber(i) = sum(msg ~= qpsk_demodulated)/msg_len;
  % Plot BER vs SNR curves for BPSK and QPSK
  semilogy(snr dB, bpsk ber, 'b', snr dB, qpsk ber, 'r');
  xlabel('SNR (dB)');
  ylabel('Bit Error Rate');
  title('BPSK vs OPSK Modulation and Demodulation'):
  legend('BPSK', 'QPSK');
                                                        Task explanation
In this code, we first generate a random message of length 'msg len', and then
modulate it using both BPSK and QPSK. We then simulate transmission over a
Gaussian channel with different SNR values, and for each SNR value, we calculate the
noise variance, add Gaussian noise to the modulated signals, and demodulate the
received signals using BPSK and QPSK demodulation. We finally calculate the bit
error rate (BER) for both modulations and plot the BER vs SNR curves for
comparison.
By running this code, we can see that QPSK modulation provides better BER
performance than BPSK modulation at the same SNR value. This is because QPSK car
transmit twice as many bits per symbol as BPSK, resulting in a higher spectral
efficiency. However, QPSK also requires more complex modulation and demodulation
schemes compared to BPSK, which may result in higher implementation complexity
```

Prompt is based on the previous one.

Compare it with BPSK

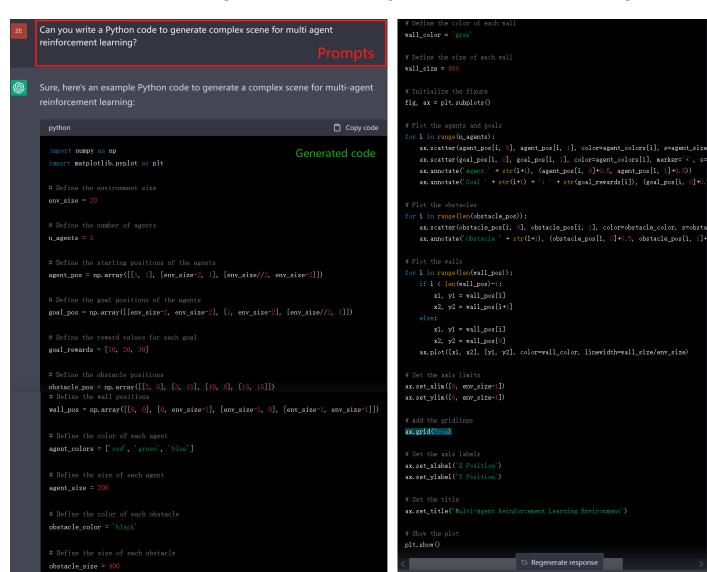
Result is reasonable



The challenge is how to efficiently design the prompts for ChatGPT.

Example: data generation for multi-agent systems

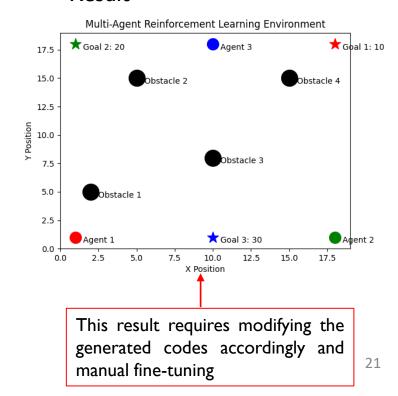
Use ChatGPT to generate a complex scene for multi-agent reinforcement learning



Prompts

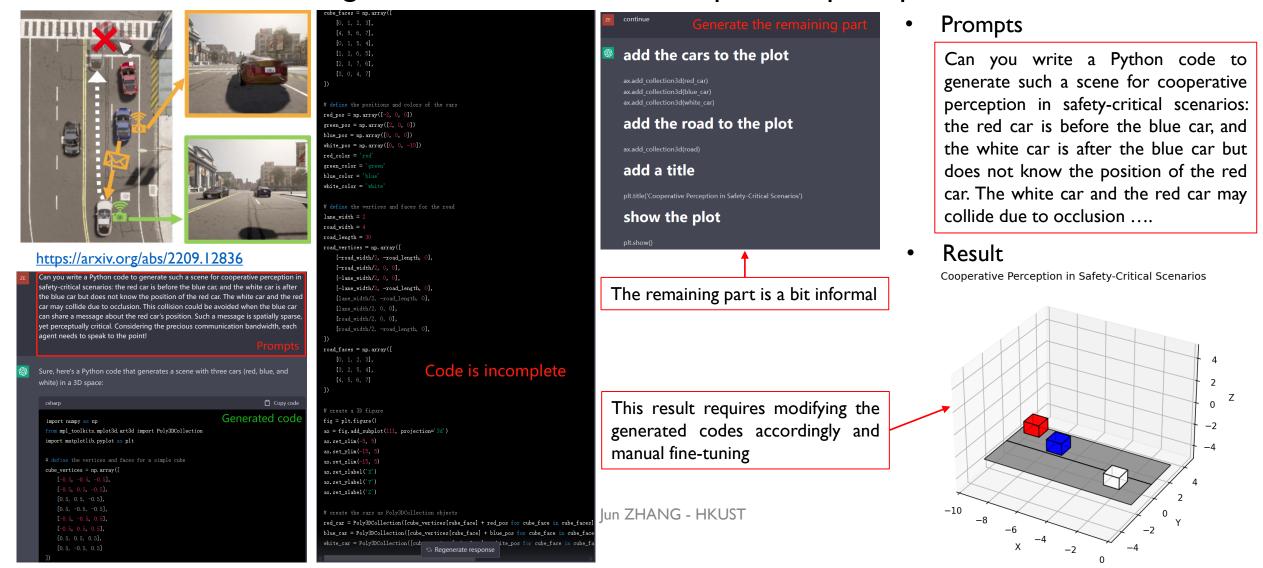
Can you write a Python code to generate complex scene for multi agent reinforcement learning?

Result



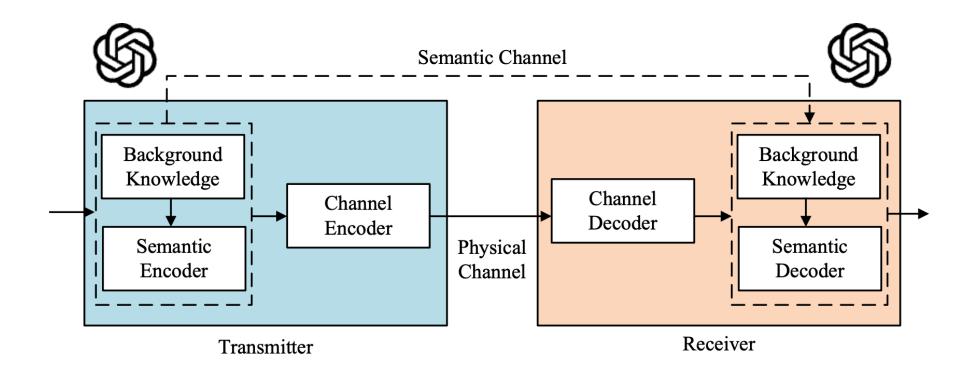
Example: data generation for cooperative perception

• Use ChatGPT to generate a 3D scene for cooperative perception



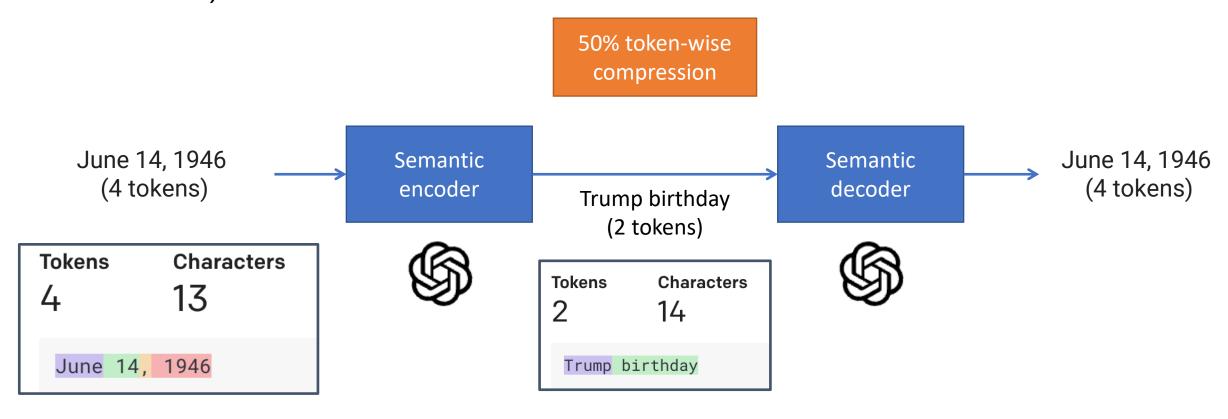
Use case: Semantic communication

• Use ChatPGT as a knowledge base in semantic communication.



Use case: Semantic communication

• Semantic coding & decoding by using ChatGPT (and large language models).



Use case: Semantic communication

The challenge is how to quantify the transmission error rate.

can you extract one prompt from the following context

Sure! Please provide the context from which you would like me to extract the prompt.

Reinforcement learning (RL) is an area of machine learning concerned with how intelligent agents ought to take actions in an environment in order to maximize the notion of cumulative reward. Reinforcement learning is one of three basic machine learning paradigms, alongside supervised learning and unsupervised learning. Reinforcement learning differs from supervised learning in not needing labelled input/output pairs to be presented, and in not needing sub-optimal actions to be explicitly corrected. Instead the focus is on finding a balance between exploration (of uncharted territory) and exploitation (of current knowledge).

Ask ChatGPT to extract the prompt or meaningful information from a context

A context copy from Wikipedia about the definition of reinforcement learning (RL)

Extracted meaningful information or

Transmitter

Sure! Here's a possible prompt:

Encoder

Decoder

What is reinforcement learning and how does it differ from supervised learning in terms of input/output pairs and the correction of sub-optimal actions?

What is reinforcement learning and how does it differ from supervised learning in terms of input/output pairs and the correction of sub-optimal actions?

Reinforcement learning (RL) is an area of machine learning that deals with how agents should act in an environment to maximize a cumulative reward. Unlike

Feed this prompt to the ChatGPT

prompt of the above context

Generated content about RL

Receiver

\$

supervised learning, RL does not require labeled input/output pairs for training, and it does not need sub-optimal actions to be explicitly corrected. Instead, RL algorithms aim to find a balance between exploration of new strategies and exploitation of current knowledge to achieve the highest reward.

Wireless Communication for ChatGPT

How to support ChatGPT-enabled mobile applications?

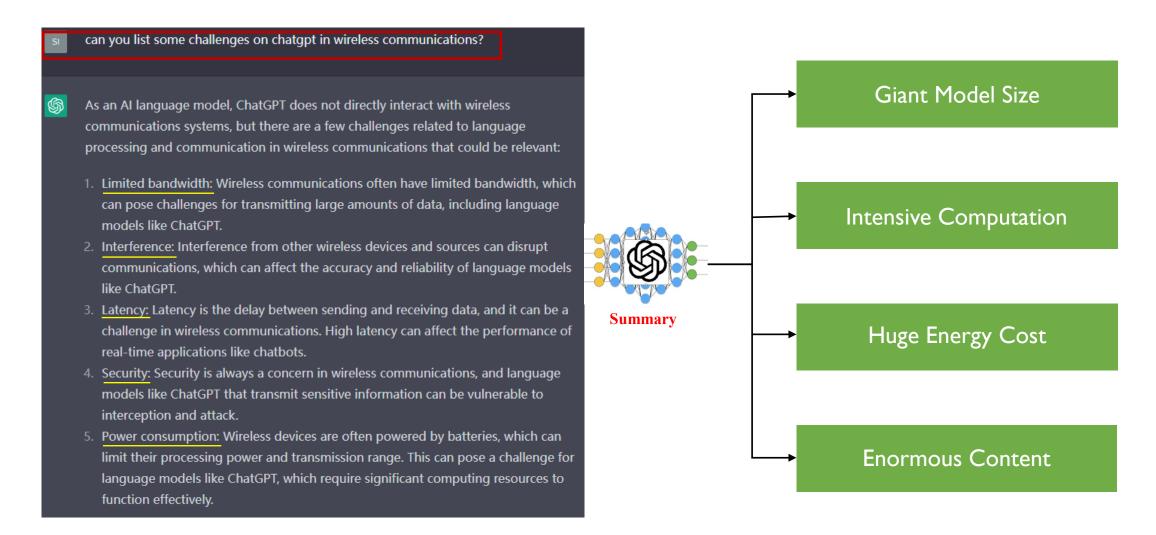
What does ChatGPT say?

- si can you list some challenges on chatgpt in wireless communications?
 - As an AI language model, ChatGPT does not directly interact with wireless communications systems, but there are a few challenges related to language processing and communication in wireless communications that could be relevant:
 - Limited bandwidth: Wireless communications often have limited bandwidth, which can pose challenges for transmitting large amounts of data, including language models like ChatGPT.
 - 2. Interference: Interference from other wireless devices and sources can disrupt communications, which can affect the accuracy and reliability of language models like ChatGPT.
 - 3. <u>Latency:</u> Latency is the delay between sending and receiving data, and it can be a challenge in wireless communications. High latency can affect the performance of real-time applications like chatbots.
 - Security: Security is always a concern in wireless communications, and language models like ChatGPT that transmit sensitive information can be vulnerable to interception and attack.
 - 5. <u>Power consumption:</u> Wireless devices are often powered by batteries, which can limit their processing power and transmission range. This can pose a challenge for language models like ChatGPT, which require significant computing resources to function effectively.

- Can you provide some solutions to help overcoming the above challenges
- © Certainly! Here are some potential solutions to help overcome the challenges mentioned earlier:
 - Limited bandwidth: To overcome the challenge of limited bandwidth in wireless communications, compression techniques can be used to reduce the amount of data that needs to be transmitted. Additionally, techniques like data prioritization and adaptive modulation can help optimize the use of available bandwidth.
 - 2. Interference: Interference can be reduced by using <u>frequency hopping</u>, which allows wireless devices to switch between different frequencies to avoid interference. Signal processing techniques like interference cancellation can also help reduce the impact of interference.
 - 3. Latency: To reduce latency, techniques like <u>data caching and local processing</u> can be used to minimize the amount of data that needs to be transmitted. Additionally, real-time data compression and transmission protocols like WebSockets can help improve the speed of data transmission.
 - 4. Security: To ensure the security of wireless communications, encryption techniques like SSL and TLS can be used to encrypt data in transit. Additionally, authentication and authorization mechanisms can be used to ensure that only authorized users can access data.
 - 5. Power consumption: To reduce power consumption in wireless devices, energy-efficient protocols like ZigBee and Bluetooth Low Energy can be used.
 Additionally, techniques like adaptive power management and duty cycling can help reduce power consumption without compromising performance.



New challenges brought by ChatGPT-enabled applications?



Implications to wireless communications

• Challenge I: Giant model size



- Model transmission is not possible
- May transmit part of/distilled model

Challenge 2: Intensive computation

- Cloud-edge based solutions
- Limited on-device fine-tuning

Challenge 3: Huge energy cost



- More efficient training
- Energy-efficient fine tuning

Challenge 4: Enormous content

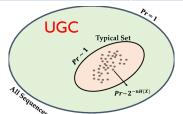


- Higher network capacity
- New distortion metric of AIGC

Case study: Semantic measures for AIGC

➤ What is the difference between UGC and AIGC?

	UGC	AIGC
Creator	Individuals	Computers
Control	Fully controlled by	Algorithms or model
	users	parameters
Purpose	A range of reasons	Specific, task-oriented purpose
Legitimacy and	more authentic and	more skepticism, error
Authenticity	trustworthy	content generated randomly
Quality and	Informal, vary widely in	Consistent in quality and style,
Consistency	quality, style, and tone	fewer variations in tone





Hypothesis: The AIGC typical set may be much smaller than the UGC typical set due to quality and consistency considerations

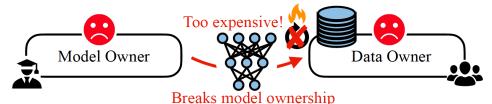
- What types of distortion metrics are more suitable for source coding?
 - Mean Square Error (MSE)
 - Peak Signal-to-Noise Ratio (PSNR)
 - Structural Similarity Index (SSI)
 - Wasserstein Distance Metric?
- What types of errors are more detrimental in channel coding?
 - Burst Error: two or more consecutive bits are corrupted during transmission
 - Random error: single bit is corrupted randomly during transmission
 - Other types of errors?

Case study: Privacy-preserving on-device fine tuning

Giant Model Size



(a) Downstream users upload data for fine-tuning



(b) Model owner releases the model to downstream users

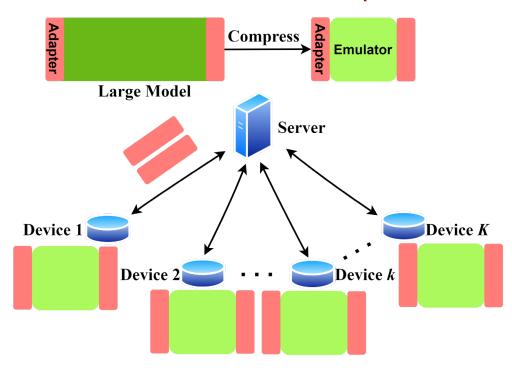


Protect the privacy of both parties

(c) Offsite-Tuning: private and efficient adaptation

https://arxiv.org/abs/2302.04870

- One solution
 - The model owner shares a lossy compressed emulator and an adapter
 - The data owner trains the adapter







Takeaways

- Al becomes real!
 - It is bringing a revolution
- New opportunities for wireless
 - AIGC-enabled techniques
- New challenges for wireless
 - Giant model size, intensive computation, huge energy cost, enormous content
- Everyone needs to learn prompting engineering!

Thank you!

• For more details

https://eejzhang.people.ust.hk/