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McKinsey Explainers

What is prompt engineering?

Prompt engineering is the practice of designing inputs for AI tools that will produce optimal outputs.



Let's say you're making spaghetti marinara for dinner. Sauce from a jar is perfectly fine. But what if you buy your tomatoes and basil from the farmers market to make your own sauce? Chances are it will taste a lot better. And what if you grow your own ingredients in your garden and make your own fresh pasta? A whole new level of savory deliciousness.

Just as better ingredients can make for a better dinner, better inputs into a generative AI (gen AI) model can make for better results. These inputs are called prompts, and the practice of writing them is called prompt engineering. Skilled prompt engineers design inputs that interact optimally with other inputs in a gen AI tool. These inputs help elicit better answers from the AI model, meaning the model can perform its tasks better, such as writing marketing emails, generating code, analyzing and synthesizing text, engaging with customers via chatbots, creating digital art, composing music, or any of the other hundreds, if not thousands, of current applications.

Gen AI has an important role to play in the future of business and society. But where does prompt engineering fit in? And how do you write a good prompt? Read on to find out. Learn more about McKinsey's Digital Practice.

What is generative AI?

First things first: a refresher on gen Al. Gen Al models are applications typically built using foundation models. These models contain expansive artificial neural networks, inspired by the billions of neurons connected in the human brain. Foundation models are part of what's called deep learning, which refers to the many deep layers within neural networks. Deep learning has powered many recent advances in Al-things you're probably already using, like Alexa or Siri-but foundation models represent a significant evolution within deep learning. Unlike previous deep-learning models, foundation models can process massive and varied sets of unstructured data. Al that is trained on these models can perform tasks such as answering questions and classifying, editing, summarizing, and drafting new content.

Here is an example of the value of specificity in prompt engineering. We asked Lilli, McKinsey's proprietary gen Al tool, to help summarize a report. We gave the tool two prompts, with specific requests for different kinds of information. Take a look at the different outputs Lilli provided.

SPECIFIC PROMPTS HELP MODELS UNDERSTAND WHAT YOU WANT

"Summarize the 2023 McKinsey Women in the Workplace report and make three specific recommendations for improvement."

"The report provides recommendations for companies to address bias and improve opportunities for women, particularly women of color, in the workplace. It emphasizes the importance of promoting women to entry-level management positions, implementing training and tools to address bias in decision-making, and setting tangible goals to hold companies accountable for progress. The text also suggests tracking metrics such as hiring, promotions, attrition, and employee sentiments to identify and address any gender disparities. Additionally, the text highlights the need to increase awareness and training on unconscious bias, establish robust tracking and metrics for career development programs, and regularly review and update evaluation processes to prevent bias. Lastly, it suggests that managers should mentor and guide all team members equally, prioritize building trusting relationships with all team members, and focus on results rather than where and when work gets done.

Recommendations for improvement:

- 1. Implement a hybrid work model: The text suggests that a hybrid work model can benefit women by providing more flexibility and reducing the need for long commutes. This can help to attract and retain female employees, particularly those with caregiving responsibilities. Companies can also use this model to create more inclusive policies that support work-life balance for all employees
- Track and address gender disparities in hiring and promotions: The text recommends tracking metrics such as hiring, promotions, and attrition to identify any gender disparities. Companies can use this data to address any biases in their hiring and promotion processes and ensure that women have equal opportunities for career advancement
- 3. Regularly survey employees for feedback on job satisfaction and inclusion: The text suggests that companies should regularly survey employees to gather feedback on job satisfaction and inclusion. This can help to identify any issues or concerns that employees may have and provide insights into how to improve the workplace culture. Companies can use this feedback to make changes that promote diversity, equity, and inclusion in the workplace"

"Why does a flexible workplace support diversity? Cite 4 statistics from McKinsey's 2023 Women in the Workplace report."

"Based on the report 'Women in the Workplace 2023,' a flexible workplace supports diversity for several reasons, as supported by the following statistics:

- Increased job satisfaction and retention: 68% of employees believe that a flexible workplace supports diversity, which can lead to increased job satisfaction and retention among employees of all backgrounds
- 2. Highly valued by employees: 83% of employees highly value opportunities to work flexibly, indicating that a flexible workplace is an important factor in attracting and retaining a diverse workforce
- 3. Reduced need to leave or reduce work hours: 38% of employees say that they would have had to otherwise leave their company or reduce their work hours without flexibility, highlighting the importance of flexibility in retaining diverse talent
- 4. Fosters diversity, equity, and inclusion: 78% of top-performing companies believe that a flexible workplace fosters diversity, equity, and inclusion, indicating that a flexible workplace is not only important for individual employees but also for the overall success of the organization

These statistics suggest that a flexible workplace supports diversity by increasing job satisfaction and retention, attracting and retaining diverse talent, reducing the need for employees to leave or reduce work hours, and fostering diversity, equity, and inclusion within the organization. By embracing flexibility and creating a workplace that values and supports employees of all backgrounds, organizations can build a more diverse and successful workplace."

How are organizations deploying gen AI?

Developing a gen AI model from scratch is so resource intensive that it's out of the question for most companies. Organizations looking to incorporate gen AI tools into their business models can either use off-the-shelf gen AI models or customize an existing model by training it with their own data.

Other organizations, including McKinsey, have launched their own gen Al tools. Morgan Stanley has launched a gen Al tool to help its financial advisers better apply insights from the company's 100,000-plus research reports. The government of Iceland has partnered with OpenAl to work on preserving the Icelandic language. And enterprise software company Salesforce has integrated gen Al technology into its popular customer relationship management (CRM) platform. McKinsey's Lilli provides streamlined, impartial search and synthesis of vast stores of knowledge to bring the best insights, capabilities, and technology solutions to clients.

How can you develop prompt engineering skills?

Getting good outputs isn't rocket science, but it can take patience and iteration. Just like when you're asking a human for something, providing specific, clear instructions with examples is more likely to result in good outputs than vague ones.

How will gen AI affect the workforce?

McKinsey's latest research suggests that gen Al is poised to boost performance across sales and marketing, customer operations, software development, and more. In the process, gen Al could add up to \$4.4 trillion annually to the global economy, across sectors from banking to life sciences.

The breakthroughs powered by gen Al will also change the workforce. One of gen Al's strengths is

that it can help nearly everyone with their jobs. This is also one of the technology's greatest challenges. McKinsey estimates that gen Al and other technologies have the potential to automate work activities that absorb up to 70 percent of employees' time today. This is largely due to gen Al's ability to predict the patterns found in natural language. This, in turn, means that gen Al stands to have more impact on knowledge work associated with occupations that have higher wages and more educational requirements. And this change will likely happen fast: McKinsey estimates that half of today's work activities could be automated between 2030 and 2060. That's roughly a decade earlier than our previous estimates.

These developments will mean big changes in the labor market. Gen Al could enable labor productivity growth of up to 0.6 percent annually through 2040—but that all depends on how fast organizations are able to adopt the technology and effectively redeploy workers' time. Employees with skills that stand to be automated will need support in learning new skills, and some will need support with changing occupations.

Learn more about McKinsey's Digital Practice.

Are organizations already hiring prompt engineers?

Organizations are already beginning to make changes to their hiring practices that reflect their gen Al ambitions, according to McKinsey's latest survey on Al. That includes hiring prompt engineers.

The survey indicates two major shifts. First, organizations using AI are hiring for roles in prompt engineering: 7 percent of respondents whose organizations have adopted AI are hiring in this category. Second, organizations using AI are hiring much fewer engineers for AI-related software than in 2022: 28 percent of organizations reported hiring for these roles in 2023, down from 39 percent in 2022.

If organizations are hiring prompt engineers, does that mean existing employees will be pushed out?

Prompt engineering is likely to become a larger hiring category in the next few years, but organizations also expect to reskill their existing employees in Al. Nearly four in ten respondents reporting Al adoption expect more than a fifth of their companies' workforces to be reskilled, whereas only 8 percent say the size of their workforces will decrease by more than a fifth.

Learn more about QuantumBlack, Al by McKinsey.

How might prompt engineering help organizations—say, banks—serve clients more efficiently?

As just one example of the potential power of prompt engineering, let's look at the banking industry. Banks have plenty of value to gain from gen Al. McKinsey estimates that gen Al tools could create value from increased productivity of up to 4.7 percent of the industry's annual revenues. That translates to nearly \$340 billion more per year. Prompt engineering has a role to play in helping banks capture this value. Here's how.

Let's say a large corporate bank wants to build its own applications using gen AI to improve the productivity of relationship managers (RMs). RMs spend a lot of time reviewing large documents, such as annual reports and transcripts of earnings calls, to stay up to date on a client's priorities. The bank decides to build a solution that accesses a gen Al foundation model through an API (or application programming interface, which is code that helps two pieces of software talk to each other). The tool scans documents and can quickly provide synthesized answers to questions asked by RMs. To make sure RMs receive the most accurate answer possible, the bank trains them in prompt engineering. Of course, the bank also should establish verification processes for the model's outputs, as some models have been known to hallucinate, or put out false information passed off as true.

This isn't just a hypothetical example. In September 2023, Morgan Stanley launched an Al assistant using GPT-4, with the aim of helping tens of thousands of wealth managers find and synthesize massive amounts of data from the company's internal knowledge base. The model combines search and content creation so wealth managers can find and tailor information for any client at any moment.

A European bank developed a gen-Al-based environmental, social, and governance virtual expert. The model answers complex questions based on prompts, identifies the source of each answer, and extracts information from pictures and tables.

In these examples, hypothetical and otherwise, the better the prompt, the better the output.

Learn more about McKinsey's Digital Practice and QuantumBlack, Al by McKinsey. And check out gen-Al-related job opportunities if you're interested in working at McKinsey.

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Get to know and directly engage with senior McKinsey experts on prompt engineering

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