

**EMBRACING DISRUPTION** 

# Artificial Intelligence moves from generation to reasoning



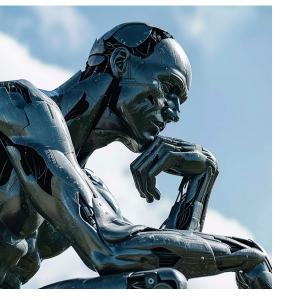
**Sebastian Thomas** Voya Investment Management



**James Chen** Voya Investment Management



**Stephen Jue**Voya Investment
Management



Generative artificial intelligence is entering a new chapter—one where machines can reason through complex problems, approaching human-level capabilities. This leap will drive significant AI infrastructure expansion as workload demands grow exponentially. Moreover, we believe it will fundamentally reshape the AI landscape across sectors by enabling unprecedented automation.

We can look at the evolution of generative AI through the lens of Nobel laureate Daniel Kahneman's framework for breaking down human thinking into "system 1" and "system 2": system 1 is fast and relies on intuition, while system 2 is a deliberate and conscious mental process.

In 2022, the initial wave of generative AI models mimicked system 1 thinking. These models required relatively little compute but often suffered from inaccuracies and hallucinations. They were good at simple tasks, simply regurgitating what they know, but fell short of replicating human-like system 2 reasoning.

# Key takeaways

- "Reasoning AI" is the next major evolution of generative AI, advancing beyond oneshot inferences to emulating human-like, step-by-step logic and decision-making.
- This shift dramatically increases compute intensity, driving a new wave of infrastructure investment in chips, data centers, and power systems.
- Even as enterprise adoption is still in its early stages, the potential productivity gains of AI agents and reasoning workflows represent a transformative platform shift.
- For investors, reasoning
   Al offers a generational
   opportunity to capitalize on
   emerging winners across
   hardware, software, and
   Al-enabled execution.



### ARTIFICIAL INTELLIGENCE MOVES FROM GENERATION TO REASONING

The new class of AI reasoning models approach tasks through step-by-step logic, self-questioning, iterative analysis, and triple-checking answers. Rather than producing a single, fast response, they break down problems into sequential parts, improving accuracy and reliability. This type of AI inferencing is computationally intense and mimics the logical and high-effort characteristic of system 2 thinking.

This evolution isn't simply a technical upgrade—it introduces entirely new capabilities. Reasoning AI can better understand nuance. It can handle ambiguous queries. And it can troubleshoot its own output and ask humans for clarification. These capabilities pave the way for more advanced enterprise applications, from legal contract reviews to advanced scientific research, autonomous decision-making, and even complex medical diagnosis.

# Scaling the AI ecosystem

The infrastructure needs to support the new AI models are staggering. Reasoning AI is proving far-more compute-intensive than expected, with Nvidia estimating that the models may require 100 times more computational power than traditional generative models.<sup>1</sup>

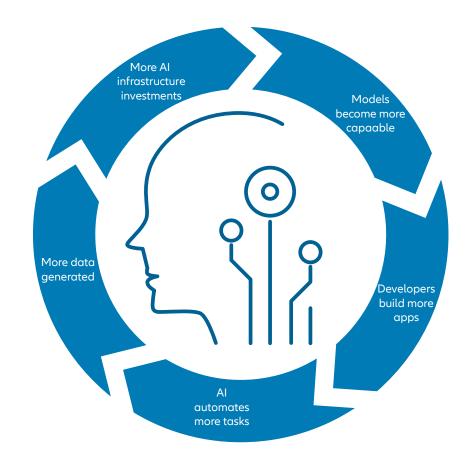
To meet this demand, hyperscalers, chipmakers, and data center operators are racing to build out next-generation AI compute

platforms. This includes specialized hardware such as Nvidia's Grace-Blackwell system and its next-generation Vera-Ruben system, along with custom AI silicon and increasingly dense and energy-efficient data centers. Power grid requirements and cooling innovations are also becoming investment focal points. Indeed, the Dell'Oro Group predicts that AI data center spending could reach \$1.1 trillion a year by 2029.<sup>2</sup>

Further, we believe there is massive latent demand for reasoning AI capabilities to drive the investment wave. A clear example of this is the launch of DeepSeek, a highly

efficient AI model with reasoning capabilities.

Contrary to fears that more efficient models would reduce compute usage, DeepSeek's debut led to a surge for more workloads across inference platforms. This underscores a powerful dynamic—better and more efficient reasoning capabilities amplify usage. As models become more capable, developers build more applications, automate more tasks, and push models into more complex domains, leading to an exponential rise in demand. This trend follows Jevons' Paradox: increased efficiency drives greater consumption.



 $<sup>^{\</sup>rm 1}~$  Nvidia CEO Jensen Huang's keynote presentation at NVIDIA's GTC event, 03/18/25.

<sup>&</sup>lt;sup>2</sup> Dell'Oro Group analysis as reported in "Data center spending to top \$1 trillion by 2029 as AI transforms infrastructure," NetworkWorld, 02/18/25.

## The adoption curve is just ramping up

We believe the largest and most impactful deployments are still to come. A recent BCG report shows that nearly 75% of companies are still in the exploration and experimentation stage for Al.<sup>3</sup> To adopt reasoning Al, enterprises must address a variety of challenges: securing customer data, hiring Al specialists, redesigning operational workflows, and justifying the investment to various committees. This process is reminiscent of the early cloud era, when full-scale migration took years to materialize.

Looking ahead, we see a future where companies stitch together complex workflows using reasoning AI to unlock significant productivity gains. These applications, often referred to as "AI agents," act as autonomous digital workers that operate on top of existing software stacks, datasets, and tools to carry out business objectives.

This transformation is still in its early stages, but the trajectory is clear.

Companies that effectively augment their human workforce with AI agents will likely achieve a powerful multiplier effect—streamlining operations, accelerating decision-making, and gaining a competitive edge in their markets.

### The investment implications are far-reaching

In short, demand for AI compute is climbing—driven by both the technical intensity of reasoning models and the anticipated explosion of real-world use cases.

For investors, this represents a generational opportunity to position ahead of true industry transformation. This includes companies that build the infrastructure, companies that leverage reasoning AI to create new intelligent applications, and companies that can extend industry leadership through AI-enabled execution.

The race is on. And those who understand the difference between today's AI and tomorrow's reasoning AI may stand to gain the most.



<sup>&</sup>lt;sup>3</sup> "Where's the value in AI?" BCG, 10/24/24.

### ARTIFICIAL INTELLIGENCE MOVES FROM GENERATION TO REASONING

Allianz Global Investors and Voya Investment Management entered into a long-term strategic partnership on 25 July 2022, upon which the investment team transferred to Voya Investment Management. This did not materially change the composition of the team, the investment philosophy nor the investment process. Management Company: Allianz Global Investors GmbH. Delegated Manager: Voya Investment Management Co. LLC ("Voya IM").

The document is for use by qualified Institutional Investors (or Professional/Sophisticated/Qualified Investors as such term may apply in local jurisdictions).

This document or information contained or incorporated in this document have been prepared for informational purposes only without regard to the investment objectives, financial situation, or means of any particular person or entity. The details are not to be construed as a recommendation or an offer or invitation to trade any securities or collective investment schemes nor should any details form the basis of, or be relied upon in connection with, any contract or commitment on the part of any person to proceed with any transaction.

Any form of publication, duplication, extraction, transmission and passing on of the contents of this document is impermissible and unauthorised. No account has been taken of any person's investment objectives, financial situation or particular needs when preparing this content of this document. The content of this document does not constitute an offer to buy or sell, or a solicitation or incitement of offer to buy or sell, any particular security, strategy, investment product or services nor does this constitute investment advice or recommendation.

The views and opinions expressed in this document or information contained or incorporated in this document, which are subject to change without notice, are those of Allianz Global Investors at the time of publication. While we believe that the information is correct at the date of this material, no warranty of representation is given to this effect and no responsibility can be accepted by us to any intermediaries or end users for any action taken on the basis of this information. Some of the information contained herein including any expression of opinion or forecast has been obtained from or is based on sources believed by us to be reliable as at the date it is made, but is not guaranteed and we do not warrant nor do we accept liability as to adequacy, accuracy, reliability or completeness of such information. The information is given on the understanding that any person who acts upon it or otherwise changes his or her position in reliance thereon does so entirely at his or her own risk without liability on our part. There is no guarantee that any investment strategies and processes discussed herein will be effective under all market conditions and investors should evaluate their ability to invest for a long-term based on their individual risk profile especially during periods of downturn in the market.

Investment involves risks, in particular, risks associated with investment in emerging and less developed markets. Any past performance, prediction, projection or forecast is not indicative of future performance. Investors should not make any assumptions on the future on the basis of performance information in this document. The value of an investment and the income from it can fall as well as rise as a result of market and currency fluctuations and you may not get back the amount originally invested.

Investing in fixed income instruments (if applicable) may expose investors to various risks, including but not limited to creditworthiness, interest rate, liquidity and restricted flexibility risks. Changes to the economic environment and market conditions may affect these risks, resulting in an adverse effect to the value of the investment. During periods of rising nominal interest rates, the values of fixed income instruments (including short positions with respect to fixed income instruments) are generally expected to decline. Conversely, during periods of declining interest rates, the values are generally expected to rise. Liquidity risk may possibly delay or prevent account withdrawals or redemptions.

July 2025