Preparing for systemic risks in the age of generative attificial intelligence

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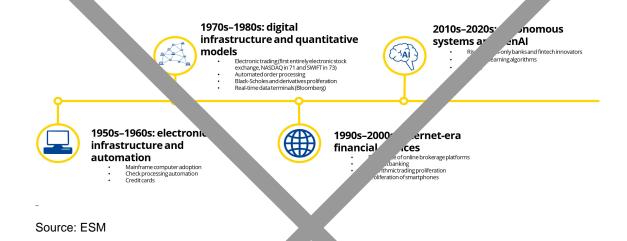
Large language models capable of get ating ann-like text have evolved rapidly over the past few years. With this leap is schnology, it came possible to generate coherent text using artificial intelligence (which, in turn, least the proliferation of so-called generative AI (GenAI). Mass simprovements in extraction insights from extensive domain-specific knowledge stronger about by GenAI is wide, expected to reshape parts of the economy that reconn processing large amounts of information, like the financial sector.

On a fundame all level, the financial sector operates through the continuous aggregation, analysis, a exchange of data. This intrinsic reliance on information processing has historic driven the rapid adoption of new technologies in finance, as seen in the shift from anual ledger systems to mainframe computers, open outcry to electronic to ling processing, and the telephone to the internet. Unlike previous technological developments, and substantially improves both generation and synthetisation of qualitative information. However, technological advancements in finance underscore a somewhat paradexical train. The very teste and improve the employer precesses, make the system more complex. Increased system complexity creates unpredictable interdependencies and could increase potential failure points.

At the ESM, we recognise that the systemic implications of widespread GenAl adoption demand vigilant monitoring and proactive risk management to maintain financial stability.

Figure 1: Adoption of technology in finance: a historical timeline

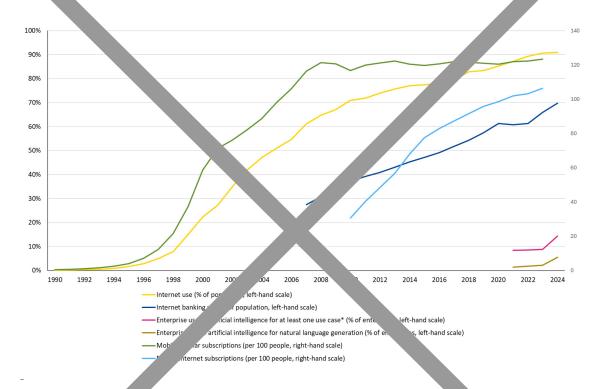




Watch out for syster ac risks

All in the form of maching garning[1] had some impact within to world of finance over the last decades. However, its adoption was often limited to specific to cases, as models were typically tailed at to particular problems and their results were to easily explainable. GenAl can har to a wide range of complex tasks based on natural language input and it also offers to the explainability of its outcomes via techniques such as characteristic new prompting. Moreover, it can absorb vast quantities of information and general new content at unprecedented speeds. These advancements make it appealing for range market adoption, particularly by companies. (Figure 2).

Figure 2: Waves of selected technology adoptions in euro area



Notes: *Al use car covered: text mining, speech recognition, natural language garation, image recognition, image processing, machine learning, Al-based software robotic process a mation, and autonomour cisions based on observation of surroundings.

Source 3M calculations based on International Telecommunication Union and Eurostat data

increased systemic complexity and inherent risks. The capabilities unlocked by GenAl

Past episodes offer cautionary insights. For instance, the 1987 stock market crash was exacerbated by portfolio insurance programmes that automatically triggered selling based on market conditions. The 1998 collapse of Long-Term Capital Management illustrated how the failure of complex quantitative models could rapidly become systemic threats. Similarly, the widespread use of mathematical models and sophisticated derivatives by the turn of the century promised better risk management but ultimately contributed to the 2008 financial crisis when these tools were poorly understood until the system was under severe stress.

So, despite its benefits, GenAl could create unpredictable interdependencies and vulnerabilities not apparent under normal market conditions – issues that need proper management to prevent cascading systemic failures.



Vibe trading and new market dynamics

GenAl has the potential improve the accessibility of financial markets for retail investors but can also amperisks. Two of the main obstaces for retail investors are barriers to entry and the relation complexity of financial coducts. GenAl-equipped platforms can help overcome both roblems by proving personalised investment recommendations, simplifying competition financial capa, and facilitating seamless execution of investment and trading strategies us to native language input. This way, GenAl can enable broader participation in complex treety gractivities using intuitive interfaces.

This democratisation improves financial inclusion. It can enhance market efficiency but also introduces new sources of volunity and system risk. Retail investors may not fully understand the underlying risk of limitations of the Gene I systems they are employing for investment advice. For in lance, there is a potential for lidespread adoption of "vibe trading" – an approach verification investors describe their objection in natural language as prompt to GenAl tune for financial advice and subsequently levering the technology to execute the strate of provided by GenAl without thorough critical equation, deferring largely to the ConAl's implicit inference. As a result, retail investors might unknowingly adopt correlated strategies derived from similar model training data. This could inadverte by mirror the coordinated behaviours as seen for instance in the 2conGame opposition of the condinated behaviours as seen for instance in the 2conGame opposition.

risks. Traditional retail investment requires individual decision-making and manual execution, creating natural frictions that limit the speed and scale of market movements caused by retail investors. However, retail investors using similar decision making and trading algorithms may adopt correlated investment strategies. If these tools are widely used, the resulting trading volumes can exceed market absorption capacity and trigger liquidity crunches. Moreover, retail investors may be more prone to panic selling or speculative behaviour during market stress, lacking the sophisticated risk management and dynamic investment strategies, and regulatory oversight of institutional investors. These actions could amplify volatility and create feedback loops that destabilise markets. All enabled systems can eliminate market frictions, allowing simultaneous mass participation in market movements by retail investors that could then overwhelm traditional market stabilisation mechanisms.

Unknown unknowns



Cutting-edge A hodels may lead to the emergence of never-before-scale financial products. New Ge I models equipped with chain-of-thought reasoning capabilities can synthesise insights to vast datasets and identify patterns that cape human detection. As these systems become more sophisticated in analysing maket data and identifying arbitrage opportunities, the ay create increasingly com x financial instruments designed to exploit market inential encies or regulatory s. This, in turn, enables the creation of financial innovations are investment strengies that may outstrip the development of appropriate risk man, whent from eworks, thus embedding risks that are not apparent to human analysts. History are as that financial innovations often precede the regulatory and risk management structure needed to contain their systemic implications. For example, the proliferation of in the tagge-backed securities and collateralised debt obligations in the arly 2000s emplifies how innovative financial instruments can create systemic unerabilities before peir risks are widely understood or adequately regulated. Therefore, new generations of Alandels have the potential to create hidden vulnerabiliti anat only become apparent unc stress.

One particular avenua of GenAl propagation in the financial section of potential concern is the introduction of ally autonomous Al investment systems. Current idelines do not preclude compages from offering them as a service to retail investors, the institutional investors as peginning to deploy Al-enabled systems capable of making its stment decision without human oversight. Traditional algorithmic trading systems op the account of the predetermined rules with humans in the loop. New systems that integrate or angledge Al algorithms can adapt their strategies based on market conditions and arm from their outcomes without human oversight. This adaptability, while potentially beneficial for performance, makes it extremely difficult to predict how these systems will

provide limited guidance.

Continuous vigilance needed to maintain financial stability

The transformative impact of GenAI on financial markets demands an evolution in how financial stability risks are monitored, assessed, and managed. The uneven pace and scope of GenAI integration across the financial sector call for proactive surveillance mechanisms that can identify emerging vulnerabilities before they manifest as systemic threat.



At the ESM, we accognise that ensuring financial stability in the age of anAI requires accumulating knowledge on impending AI integration in the financial ector and continuous enhancement of analytical tools. This includes critical assessing whether such tools are adequate an addressing a potentially AI-amplified crises and developing new approaches where existing a frameworks prove insufficient. Strong coordination among all institutions tasked we safeguarding financial ability is essential. As transformative AI technologies between increasingly degrated into financial markets, the ESM strives to improve its capabilities a stay about of the curve and preserve financial stability across its Members.

Further reading

Foucault, T., Gambacorta, L. Ang, W., Vives X. (2025, Artificial Intelligence in Finance. The Future of Banking 7. Control R Press.

Gambacorta, L., Sabran, F., Schiaffi, S. (2025), Artificial intelligue and relationship lending. BIS Work Paper No 1244.

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Footnotes

- [1] Machine learning refers to the process by which computers can improve their ability (i.e. "learn") to execute tasks by analysing patterns in data using statistical models, without the need for explicit instructions from humans.
- [2] Chain-of-Thought prompting is a technique that enables AI models to improve the reasoning capabilities by breaking prompts down into step-by-step reasoning processes, something akin to asking the model to "think out loud" before providing an answer.

