

# Generative Al Making Waves

Adoption waves in banking and capital markets

### Introduction

### A new horizon for financial services powered by generative Al

The financial services industry has been at the forefront of adopting generative artificial intelligence (AI), which could create an additional \$200 billion to \$340 billion in value annually in the banking industry alone, according to McKinsey<sup>1</sup>.

Generative AI is making a significant impact on employee and customer experience. It's bringing efficiency gains to financial services institutions managing large volumes of data and documents—reducing routine, repetitive work for professionals and freeing more of their time for creativity and innovation. For example, the global macro fund manager <a href="Bridgewater Associates">Bridgewater Associates</a>, is creating a large language model-powered investment analyst assistant that is able to generate elaborate charts, compute financial indicators, and create summaries of the results, based on both minimal and complex instructions.

Generative AI can also enable hyper-personalization that strengthens relationships and drives growth. NatWest Group, for example, is using generative AI to create personalized product messaging, resulting in a 900 percent growth in applications for its high interest rate accounts.

We're also seeing use of generative AI to help financial institutions investigate suspected financial crimes and compliance breaches. It is helping to automate and enhance anti-money laundering investigations, reducing time spent on manual tasks from 60 percent to 5-10 percent, as seen with <u>Verafin</u>, a Nasdaq company. Verafin's overall approach delivered a 25 percent reduction in false positives and a 250 percent improvement in wire fraud detection by value.

These early examples highlight the potential of generative AI to transform the financial services industry as new use cases gain traction, including automating the investment management compliance process and automating the extraction and summarization of pertinent parts of local regulations and other supporting documents to clear conditions for loan and insurance underwriting.

<sup>&</sup>lt;sup>1</sup> McKinsey & Company, <u>The Economic Potential of Generative AI: The Next Productivity Frontier</u>. 2024.

### Guidance for the road ahead

It's clear that generative AI is changing the data and analytics landscape rapidly—almost daily. To help financial institutions continue to plan and progress in their journey, Amazon Web Services (AWS) commissioned Celent to develop this report, which defines three distinct generative AI adoption waves in banking and capital markets and identifies strategies for navigating each.

The report is intended to help banks and capital markets organizations develop an actionable framework to harness the potential of generative AI and make informed decisions about prioritization and next steps.

### A trusted partner for the journey

Successful implementation of generative AI strategies requires a trusted partner with proven expertise in data, AI, security, and industry-specific regulations.

AWS provides financial services institutions with the services, AI capabilities, infrastructure, and robust security needed to successfully implement and scale generative AI use cases across their organizations. We are innovating across each of these areas to enable and deliver model choice; cost and performance advantages; data privacy, security, and responsible design; and AI developer success in building, training, and deploying generative models for a new generation of AI applications.

AWS is excited to share this research with the industry, and we look forward to continuing to empower, support, and innovate with financial institutions as they progress in their generative AI journey.



Vasi Philomin
VP of Generative AI
Amazon Web Services



Scott Mullins
General Manager
Worldwide Financial Services
Amazon Web Services





### A QUICK TOUR OF THE REPORT

What and Why care?

A level set for what generative AI (GenAI) is and why banking and capital markets professionals should be interested in it.

### **Waves of Adoption**

Celent has developed a threewave adoption framework. For each wave, we strive to crystallize the drivers and outcomes across banking and capital markets. **Common Use Cases** 

Given the numerous similarities in business and operating models, Celent finds many common GenAl use cases between banking and capital markets.

**Use Cases in Banking** 

Celent spotlights the unique corporate and retail banking use cases that exist primarily due to banks' role in credit, payments, and cash management.

**Use Cases in Capital Markets** 

Celent focuses on trading and investment management and differentiates across businesses within capital markets (e.g., sell side, buy side, wealth).

Conclusions and Path Forward

It is clear that GenAI is creating exceptional opportunities to transform business and operating models. The question is how fast and for which use cases. Celent summarizes its learnings.

### IN WRITING THIS REPORT, CELENT HAS DRAWN UPON SEVERAL SOURCES OF INFORMATION

### **Celent proprietary research**

**Qualitative research:** Celent continually speaks with GenAI tech providers and financial institutions (FIs) in the adoption vanguard to better understand adoption trends and underlying drivers. We also draw upon our extensive research on new technology adoption and infrastructure modernization.

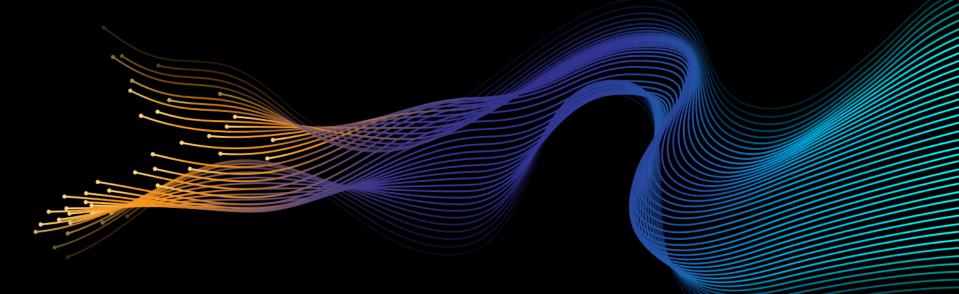
**Quantitative research:** Celent has undertaken surveys of both tech providers and FIs. We also examined data on historical technology adoption curves. In addition, we reviewed surveys undertaken by our parent company, Oliver Wyman.

**Subject matter expert input:** Alenka Grealish and Patrick Wegner are co-leaders of Celent's GenAl research and are responsible for tracking tech developments, factors accelerating and impeding adoption, and FI implementations.

### **Amazon Web Services insights**

**Client experience:** AWS has shared insights gleaned from working with banks and capital markets firms. It has hands on experience supporting these firms to leverage GenAl across the three layers of the tech stack: applications, large language models, and infrastructure to train and run Al workloads.

**Subject matter expert input:** Charith Mendis, Head of Worldwide Banking Market Development, and Ruben Falk, Capital Markets Specialist, Data Architecture, Analytics, Machine Learning & AI, provided valuable input to Celent based on their "in the field" experience and take-aways.



# **EXECUTIVE SUMMARY**

### **CATCHING THE GENERATIVE AI WAVES**

While it is early days for generative artificial intelligence (GenAI), frontrunners are already pursuing use cases across banking and capital markets. Given its strong potential, developing a GenAI blueprint is the minimum requirement for capital market participants and banks to be competitive.

ChatGPT (a publicly-available generative AI tool) broke technology adoption records within weeks of being released as a consumer good. According to a recent survey, 56% of workers are already using various forms of GenAI (<u>The Conference Board</u>). We are just at the beginning. <u>Oliver Wyman</u> estimates that GenAI could add up to \$20 trillion in global GDP by 2030. The report also found enthusiasm among survey respondents, with 42% saying they would use GenAI to help them guide large financial decisions. At the same time, GenAI is unleashing concern regarding risks, triggering regulatory action such as the EU AI Act and the recent U.S. Executive Order on Artificial Intelligence.

GenAl's potential for financial services is beginning to crystallize as financial institutions (FIs) test use cases and identify those that show the greatest potential. To help FIs distinguish the hype from reality and develop a blueprint to harness GenAl successfully, Celent has developed the **GenAl Adoption WaveGram**. With this framework, we are striving to help banking and capital markets participants to:



# Determine the factors influencing GenAl development and adoption

Celent endeavors to bring clarity and focus on the factors accelerating and impeding the adoption and evolution of use cases. Fls can then monitor these factors as they are relevant to their use of GenAI.



# Develop a strategic plan to harness GenAI

Celent's WaveGram displays a 10+ year horizon for GenAl trends and use case adoption. We view the waves as structural building blocks that have certain characteristics, drivers, and outcomes.



# Make sound decisions regarding next steps and prioritization

We identify use cases that are likely to become mainstream by wave. We create a taxonomy beginning with type (e.g., content summarization) and then pinpoint common use cases and those specific to banking and capital markets.



The technology is changing so fast in front of our eyes that I think it's almost like the limit is ourselves and being able to rationalize it,...

Marco Argenti, CIO Goldman Sachs, "Goldman Sachs
CIO Tests Generative Al". WSJ.com, May 2023

### **GUIDE TO CELENT'S GENAI ADOPTION WAVEGRAM**

Celent's **GenAl Adoption WaveGram** comprises three layers.

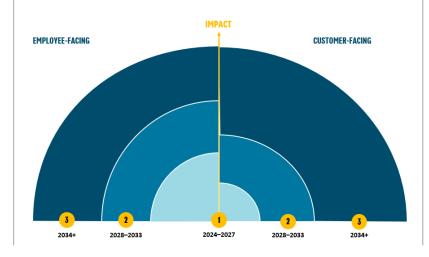
### **THREE WAVES**

Based on conversations with GenAl tech innovators, FIs in the adoption vanguard, and historical tech adoption curves, Celent anticipates that GenAl adoption will occur over three waves, with each wave encompassing specific drivers and outcomes. Drivers include both accelerators and impediments.



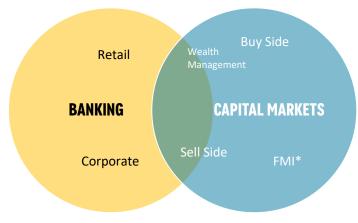
## COMMON USE CASES EMPLOYEE AND CUSTOMER-FACING

Across banking and capital markets, there are common use cases. We distinguish between customer-facing and employee-facing use cases since we expect employee-facing applications to progress faster in the medium term due to their relatively lower risk. We add an impact dimension on the vertical axis.



## INDUSTRY-SPECIFIC USE CASES BANKING AND CAPITAL MARKETS

Given differences in products/services and profit drivers between banking and capital markets, Celent spotlights use cases that are unique to each. We also recognize that use cases within these industries are not homogenous. Hence, we further distinguish use cases by line of business.



\*FMI = Financial Markets Intermediary

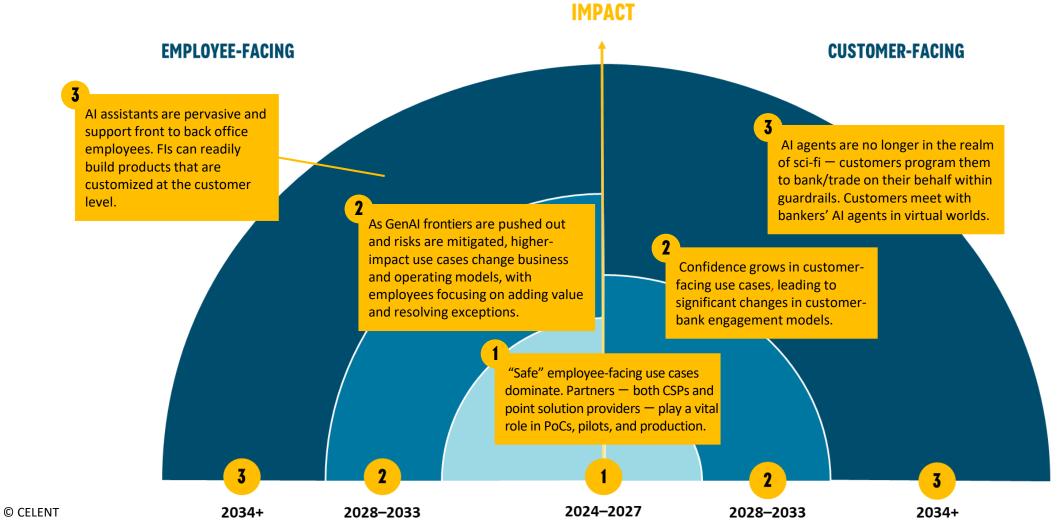
### THE WAVES: KEY TAKEAWAYS

Celent anticipates three adoption waves propelled by tech advances (e.g., faster/more efficient compute), competitive pressures, and the maturation of GenAI applications through increasing FI comfort level and regulatory clarity. To help FIs unpack the dynamics influencing GenAI development and adoption, we discuss the factors accelerating and impeding adoption and the evolution of use cases.

<b>ADOPTIO</b>	ADOPTION WAVE		CHARACTERISTICS
	1	2024–2027	Use cases in the first wave can be described overall as pragmatic. The initial focus is on use cases that promise high productivity/efficiency gains in low-risk areas with relatively low integration costs. Prime examples include code development (e.g., debugging and testing) and AI assistants to interact with large information sources. Early innovators, especially those with lower regulatory burdens, like hedge funds, will execute more advanced use cases that will not experience mainstream adoption until wave two. These players stand to gain a competitive advantage and drive further investment.
	2	2028–2033	The second wave will be characterized by higher-impact applications and deeper integration of GenAI into workflows. Fuelled by adoption accelerators (e.g., increased compute capability, lower cost and risk), FIs will test and implement more use cases and reach new frontiers (e.g., AI assistants for customers and AI generation of RFPs). The concept of augmented humans will be widely embraced across banking and capital markets. FIs will deliver highly personalized interactions via customer-facing applications. As bias and hallucination risks are controlled and model accuracy becomes sufficiently high, FIs will deliver prescriptive analytics (e.g., direct investment and financial advice).
	3	2034+	No one can accurately predict what will transpire in ten years. Instead, Celent offers a few visions of how GenAI could be coupled with other advanced technologies (e.g., quantum computing, distributed ledger technology, and virtual reality) and how AI agents could play a role in financial services. As GenAI matures further, customer-facing use cases will approach the scope and impact of employee-facing use cases. Humans will become comfortable with AI agents that act as their proxy for select activities (e.g., applying for a loan or selecting securities).

### **THE WAVES + COMMON USE CASES: KEY TAKEAWAYS**

Celent places use cases common to capital markets and banking within the three waves. Across the two industries, there are common use cases (e.g., code debugging, training material generation, customer behavior analysis) with overlaps in the value chain. We distinguish between customer-facing and employee-facing use cases since we expect employee-facing applications of GenAI to progress faster in the medium term due to their relatively lower risk. Within each wave, we spotlight use cases that will move into the mainstream. In addition, we evaluate their likely impact by taking into consideration a variety of metrics, including hard metrics (e.g., cost, revenue, and efficiency/productivity gains) as well as soft metrics (e.g., employee and customer satisfaction and ability to "wow" employees and customers).



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### **THE WAVES + INDUSTRY SPECIFIC USE CASES: KEY TAKEAWAYS**

Celent has identified several distinct use cases within banking and capital markets. Unsurprisingly, these use cases will become more impactful as the GenAI frontier is pushed out in the second and third waves of adoption. Banking has several key areas — credit, payments, and cash management — in which GenAI could unlock transformative services and customer journeys. Capital markets have an entire value chain link that is tailormade for GenAI — trading and investment management — which has abundant use cases. Celent anticipates that use cases will vary across the highly differentiated types of participants in capital markets.

### **Banking**

While many inroads have been made to digitize **retail banking**, there remains room for improvement. Credit, particularly complex products like mortgage loans, is a prime example. Employees could better serve customers via an AI assistant that suggests responses and next steps and pulls relevant information. In addition, synthetic data generation could improve a bank's ability to understand customer needs and tailor products and processes accordingly.

Customer-facing use cases are also concentrated in the area of credit. The credit process remains relatively arduous for consumers, meaning an AI assistant that can guide them and expedite the process would be highly beneficial.

GenAI could also greatly expand banks' role in consumer financial wellness. Depending on a customer's bank and third-party permissioned data, an AI assistant could help advise a customer on scenarios like creating a budget or handling an unexpected expense.

**Corporate banking** involves many complex processes, myriad systems, and extensive integrations. GenAl could streamline existing paper-based processes and digital bottlenecks. Al assistants that further automate processes (client onboarding and credit processes) will drive competitive advantage. Al assistants could also play a more transformative role by helping banks develop customized products for key clients.

Within their core payments business, banks could deliver more "intelligent" services by leveraging AI assistants for not only queries but also higher-value error prevention, detection, and correction.

Banks could greatly improve their support of corporations by providing clients with AI assistants to further digitize and automate their financial supply chain. In the long run, GenAI could be the key to delivering "self-driving" treasury.

### **Capital Markets**

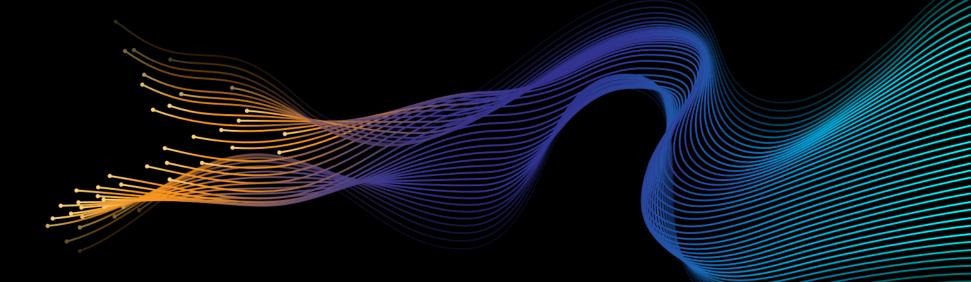
The capital markets sector is in a unique position because it includes trading and investment management, which has tremendous potential for GenAI because of:

- A huge abundance of information that is underutilized by large swathes of the industry
- A highly competitive environment where asymmetric information and insights are always urgent and can bring large rewards
- A deep understanding of active risk management allows for management of risks associated with GenAl
- The possibility to directly attribute revenues from the investment process to insights or productivity gains extracted by GenAI

As a result, there are many capital markets-specific use cases for GenAl, including data monetization, understanding and predicting market information, investment decision-making, workflow optimization, and insight personalization. While the sector will generally see a high impact from adopting GenAl, results will vary by user and area.

Examples of high-impact use case areas by participant type include:

- Wealth Management: Content generation/personalization, information synthesis
- **Buy side:** Data analysis and AI assistants for analysts
- **Sell side:** Synthetic data creation, workflow automation, and error detection
- **FMIs:** Al assistants, data analysis, workflow automation



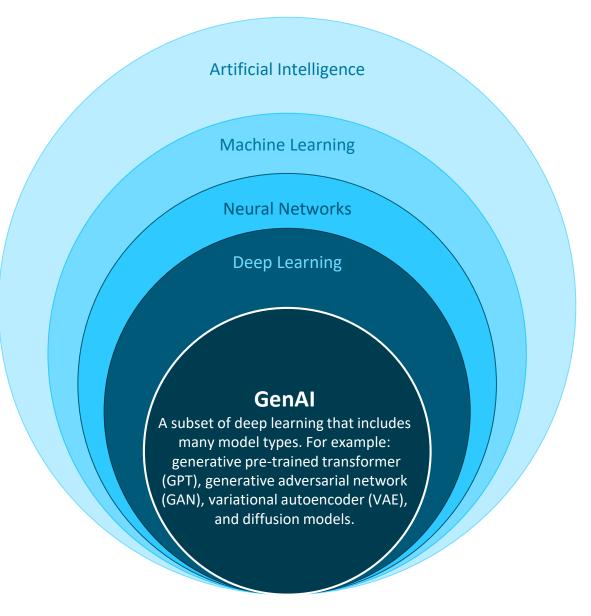
# WHAT AND WHY CARE?

### WHAT IS GENAI? A LEVEL SET ON THE TECHNOLOGY AND USE CASES

### **Generative AI (GenAI)**

GenAl is a subset of deep learning that can generate new content based on patterns learned from existing content. Content can include text/data, images, music, video, or other forms of media.

Celen	t High-Level Use Cases	Examples		
0	Content Generation	Document drafting, report generation		
: <u></u>	Content Management	Categorization, tagging, curation		
	AI Assistant – Knowledge Source	Research assistant, information retrieval		
	AI Assistant – Automation	Autofill, next best action suggestions, autonomous agents		
<u> </u>	Code Development	Debugging, refactoring, coding		
	Information Analysis	Synthesis, summarization		
	Data Analysis	Augmentation, visualization		
	Synthetic Data Generation	Text versions for analysis, time series data generation, scenario generation		
♦←O ♦→□	Workflow Improvements	Suggestions for workflow amendments, automated changes to workflows		
Q	<b>Detection Models</b>	Errors, fraud, problem solving		



### WHY CARE? STRONG POTENTIAL TO BOOST PERFORMANCE

### PRODUCTIVITY AND EFFICIENCY

GenAI is already proving in PoCs and pilots that it can reduce FIs' operating costs and improve productivity. Moreover, FIs are finding that measuring GenAI's impact on costs/productivity is relatively easy, allowing them to build business cases. Examples include:

Front office	<ul><li>Reduce cost to originate</li><li>Reduce cost to serve</li><li>Scale customer support</li></ul>
Middle and back office	<ul> <li>Enable further automation of repetitive tasks</li> <li>Enhance risk mitigation tools</li> <li>Reduce the cost to onboard clients</li> </ul>
Technology	<ul><li>Lower operating costs</li><li>Increase productivity</li></ul>
Functional areas (non-tech)	<ul> <li>Further digitize workflows</li> <li>Reduce the cost of content generation</li> </ul>

### **REVENUE GROWTH**

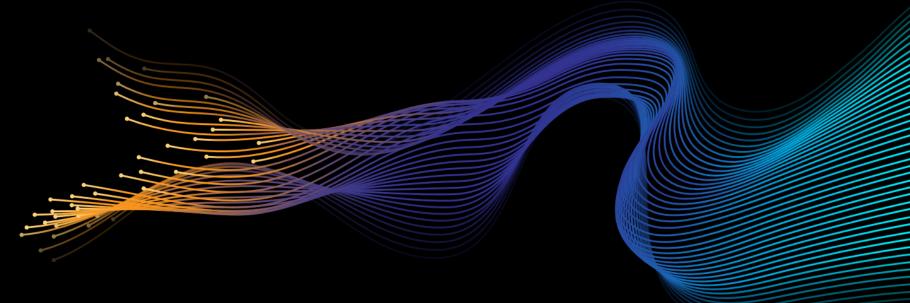
While most FIs are leading with productivity/efficiency use cases, some are blueprinting revenue-based business cases. These FIs tend to be more advanced in their digital journeys and are thereby able to shift their focus to adding value (e.g., richer, better customer experience).

	Shift to higher-value/revenue-adding tasks (e.g., cross-sell)
Front office	Achieve non-linear scaling of personalized services
Tront office	Find new revenue sources by discovering new patterns (trading)
Product staff	Improve revenue impact of product enhancements
Product Stair	Achieve pricing optimization
Current	Grow share of wallet (e.g., with improved customer understanding and experience, and personalization)
customers	Achieve trusted adviser status
New	Improve prospecting and product selection
customers	Increase engagement and conversion

### **NEXT-LEVEL PERFORMANCE**

Celent anticipates that GenAI will help FIs become data-driven organizations that make faster and smarter decisions. The underlying drivers of this shift include improved overall data access, increased data input, and user-friendly interfaces leading to deeper and more actionable insights. In the long run, as confidence in data/model-driven decisions grows, FIs will implement autonomous workflows that will lead to not only cost reduction and productivity enhancements but, more excitingly, revenue growth as employees can focus more time with the customer or adding value for them. Moreover, GenAI could enable FIs to develop completely new revenue sources (e.g., leasing a financial wellness assistant to a small business or building autonomous AI-driven customized investment vehicles).





# WAVES OF GENALADOPTION

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A level set for what GenAI is and why banking and capital markets professionals should be interested in it.

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### **THREE WAVES**

### **DEFINING AND DESCRIBING THE WAVES**

Exceptionally fast-moving technology coupled with regulatory uncertainty makes projecting the adoption of GenAl challenging. To help guide financial institutions, Celent has developed the GenAl Adoption WaveGram. We anticipate three waves of adoption propelled by tech advances (e.g., faster/more efficient compute), the growing maturity of GenAl regulation and business structures, and competitive pressures.

Celent has mapped the waves and overlaid use cases based on conversations with GenAl tech innovators, FIs in the adoption vanguard, and Celent analysis of historical tech adoption curves.

### WAVE

### **CHARACTERISTICS**

2024-2027 Use cases in the first wave can be described overall as pragmatic due to regulatory uncertainty and an evolving ecosystem. The focus is on use cases that promise productivity/efficiency gains in low-risk areas with relatively low integration costs. Early innovators will bring more advanced use cases into production that will not experience mainstream adoption until wave two. They stand to gain a competitive advantage and drive further investment.

2028-2033 The second wave will be characterized by higher impact applications and deeper integration of GenAI into workflows. Fuelled by adoption accelerators (e.g., lower cost and risk), FIs will test and implement more use cases and reach new frontiers (e.g., AI assistants for customers and AI generation of RFPs). The concept of augmented humans will be widely embraced across industries and FIs will deliver highly personalized interactions via customer-facing applications.



No one can accurately predict what will transpire in ten years. Instead, Celent offers a few visions of how GenAI could be coupled with other advanced technologies (e.g., quantum computing, distributed ledger technology, and virtual reality) and how AI agents could play a role in financial services. As GenAI matures further, customer-facing use cases will approach the scope and impact of employee-facing use cases.

### **WAVE 1: DRIVERS AND OUTCOMES**

Each adoption wave consists of drivers (factors that accelerate or impede adoption) and attendant outcomes. During wave one, the factors that accelerate adoption in banking and capital markets (CM) are those that lower costs (testing and implementation) and risks. The factors that impede adoption are technological readiness as well as legal, regulatory, and trust-related issues. As FIs move from proof-of-concept to pilot and production, they need to address multiple challenges ranging from ensuring compliance to integrating with legacy systems and reengineering processes. Most FIs will initially bring use cases into production slowly but will speed up by the end of this wave. The use cases that move into production first will be low-risk, productivity-related uses of GenAI, particularly those in which traditional AI has already been leveraged, and those with stand-alone applications (e.g., virtual assistants). FIs with a lower regulatory burden, strong competitive advantage, and revenue drivers will lead the way for the rest to follow.

### **Accelerators**

#### Al models become smaller and faster.

As a result, training and run costs decline, increasing the feasibility of use by FIs.

#### Third party providers facilitate adoption.

Hyperscalers and AI platforms provide scalable and consistent compute, AI tools, and models to facilitate use case development.

### Bank and CM early movers realize a significant edge.

They mitigate risks and build trust by optimizing GenAl/human interactions.

#### In the EU, regulatory clarity makes it easier to game plan.

The AI Act in Europe and regulation in other geographies reduce ambiguity regarding "safe" use cases.

#### Methods to lower hallucinations are developed.

A prime example is requiring a GenAl model to retrieve data from a relevant database (known as retrieval augmented generation or RAG).

### **Impediments**

#### In the US, regulation remains work in progress.

For FIs, the recent AI Executive Order and SEC proposal leave much open to interpretation and additional legislation. Onerous legislation could slow the development of GenAI as foundational models adapt to satisfy regulation.

### Computing hurdles inhibit mainstream adoption.

Issues such as the scalability of GPU infrastructure could keep select GenAI use cases from becoming mainstream.

#### Risk concern is relatively high for FIs.

Concerns regarding bias and hallucinations exclude numerous use cases as regulatory hurdles are high for banking and CM.

Combatting GenAl-enabled fraud and breaches consumes FI resources to the detriment of strategic investment.

Technical debt (especially in data management) persists. This prevents companies from taking full advantage of GenAl.

Intellectual property concerns slow down select use cases. For example, this may slow marketing content generation.

### **Outcomes**

#### Productivity-enhancing use cases lead.

Banking and capital market players will target cost take-outs, in particular:

- Digitizing manual/paper processes
- · Improving human-based processes

#### Sandbox mode dominates.

FIs favor a controlled environment for innovation, allowing business and tech teams to collaborate and build while avoiding regulatory fallout.

#### Prior AI use cases are enhanced.

GenAl enhances existing Al use cases, e.g., intelligent virtual assistants, in a cost-effective way.

#### Low-barrier use cases are exhausted.

Early mover FIs experiment with and implement use cases for which risks are contained (e.g., first draft content generation).

### Stakeholders establish frameworks to guide FI.

This is particularly relevant in the areas of regulation and governance.

Successful early innovators encourage investment in GenAl by early followers.

### **WAVE 2: DRIVERS AND OUTCOMES**

During wave two, FIs and their tech partners will make significant progress in lowering the costs and risks of GenAI. The complexity of scaling AI will be solved through advancements in computing. There will, however, be impediments that slow adoption, including heightened regulatory scrutiny and diminishing improvements in certain model types. Nevertheless, FIs will continue to build on lessons learned and improve their ability to scale models and embed GenAI across workflows and customer journeys.

### **Accelerators**

### Tech advances drive development of use cases.

Progress in computing, improved speed, availability, and reduced environmental footprint make new use cases possible. The scalability of GPU buildout improves, and new chip types are commoditised (e.g., domain specific compute, 3D stacking, etc).

### Large language model (LLM) access expands significantly.

LLMs embedded in common business software are used by most employees as the competitive field of AI marketplaces develops and GenAI models are run on personal devices.

#### Model accuracy continues to improve.

Models built from text, data, video, audio, and images better understand prompts and generate content that is more diverse, accurate, and contextually relevant.

#### Regulatory clarity is achieved globally.

The main focus is on safety, with regulations driven either by a supranational entity or agreement on global guidelines.

#### FIs overcome technical debt issues.

Modernized tech infrastructures supercharge the use of internal proprietary data in GenAl models.

### **Impediments**

An FI is fined for lack of compliance with GenAI regulations. History has proven time and time again that at least one FI will fail to comply with a regulation, heightening regulatory scrutiny and driving new regulation.

#### Rogue LLMs spur greater regulatory scrutiny.

Given the potential gains, models that support illegal activity are built.

#### Sources of good training data decline.

Model performance is eroded due to the rising share of Algenerated data in the training data, and acquiring new high-quality training data becomes more costly.

### **Outcomes**

#### FI comfort level with GenAI applications increases.

A rising number of customer-facing applications move into production.

### User interfaces (UIs) migrate from drop-downs and clicks to functionality embedded in AI assistants.

Customers are comfortable with conversation-based interfaces and AI assistants.

#### Use cases piggyback and are interwoven.

GenAI models are deeply embedded in workflows, often in various steps (e.g., in prospecting workflows beginning with list generation, then email generation and next best action).

### The use case frontier is pushed out.

For example, FIs become comfortable providing AI assistants that act as financial wellness advisers to customers.

### Competitive advantage from initial use cases is eroded. Access to models and compute becomes widespread.

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Highly specific GenAI models become the norm as costs become manageable.

### **WAVE 3: DRIVERS AND OUTCOMES**

After significant advancements between 2024-2033, pushing the GenAI frontier in 2034 and beyond will require leveraging other technologies such as quantum computing, virtual reality (VR), and distributed ledger. As humans have proven time and again, we readily adopt technology that improves our lives and work and adapt how we communicate and operate. By wave three, Celent expects that the majority of us will be comfortable having personal AI assistants and interacting with trusted AI agents.

### Accelerators

### Battle-tested models reduce risk exposures. End-user control is virtually guaranteed.

#### **Quantum computing goes into production**

Although currently in development, Quantum could go into production and further advance GenAl capabilities.

#### Effective human vs. Al identifier is launched.

For example, Tools for Humanity, which is currently building tools for the <u>Worldcoin</u> project, could achieve its ambition.

### VR/AR technology is refined and prices drop.

Adoption follows the smartphone adoption curve.

#### **GenAl and Blockchain interact.**

For example, GenAI might create a personalized financial product and tokenize it to be traded on a blockchain.

#### Compute is redefined.

A new, more holistic approach to computing power is developed with increased energy efficiency, learning capability, distributed processing and domain specific optimization. Emerging technologies such as neuromorphic and edge computing could contribute.

### **Impediments**

Model collapse due to low levels of human-generated data slows advancements.

Marginal cost of proprietary/human-created content increases, reducing ROI of GenAl initiatives.

New risks arise, e.g., autonomous agents increase data breaches.

As a result, FIs have to divert resources away from innovation to risk mitigation.

Higher likelihood that a "black swan" event erodes confidence in Al systems.

The chance that AI systems have ignored a statistically unlikely outcome leads to heavy losses and the erosion of confidence in AI-driven workflows and even individual models.

### **Outcomes**

FI customers are comfortable interacting with AI assistants.

Autonomous agents are mainstream and UIs are interactive and query-based. Customers "hire" and customize AI agents to do their banking and trading.

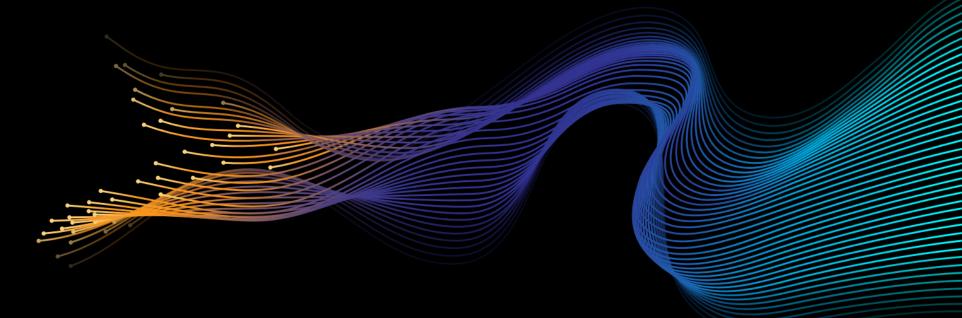
Sophisticated data analysis supports performance-based pricing for select products.

For example, corporate customers pay for FI services based on cost savings and/or revenue generation.

**GenAl allows automation of the entire product life cycle and product customization.** E.g., in corporate banking, sophisticated, dynamic liquidity structures.

Coding is completely democratized by natural language interactions.





# COMMON USE CASES ACROSS BANKING AND CAPITAL MARKETS

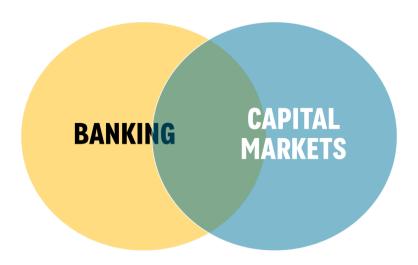
### **COMMON USE CASES**

Celent adds a second layer to its GenAI Adoption WaveGram: common employee and customer-facing use cases across banking and capital markets. Identifying these use cases helps FIs with multiple lines of business prioritize them based on their potential return, whether it is productivity/cost savings or revenue based. For example, an FI that successfully implements a common use case (e.g., call center transcript analysis) in banking can more readily implement other types of transcript analysis in capital markets.

Celent places a use case in a specific wave based on the expectation that it will become **mainstream** during that time period. Banks and capital market participants that pursue these use cases ahead of the mainstream stand to benefit from a competitive advantage. For example, banks that have historically invested in modernizing their data and tech infrastructure or hedge funds that have a lower regulatory burden are likely to be early movers in leveraging GenAI.

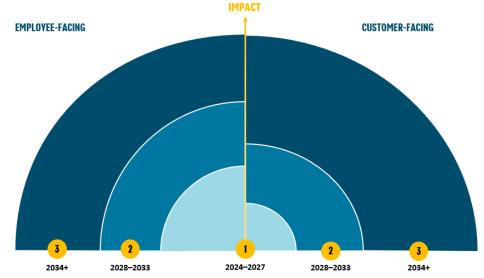
### **COMMON USE CASES ACROSS BANKING AND CAPITAL MARKETS**

Because banking and capital markets share some similar value chain components, there are common GenAI use cases in areas such as, product development, sales/marketing, customer engagement, risk/compliance, and infrastructure (i.e., operations and technology).



### **EMPLOYEE AND CUSTOMER-FACING DISTINCTION**

We distinguish between customer-facing and employee-facing use cases since we expect employee-facing uses of GenAI to progress faster due to their relatively lower risk. To further differentiate these use cases, we add an impact dimension to the vertical axis.



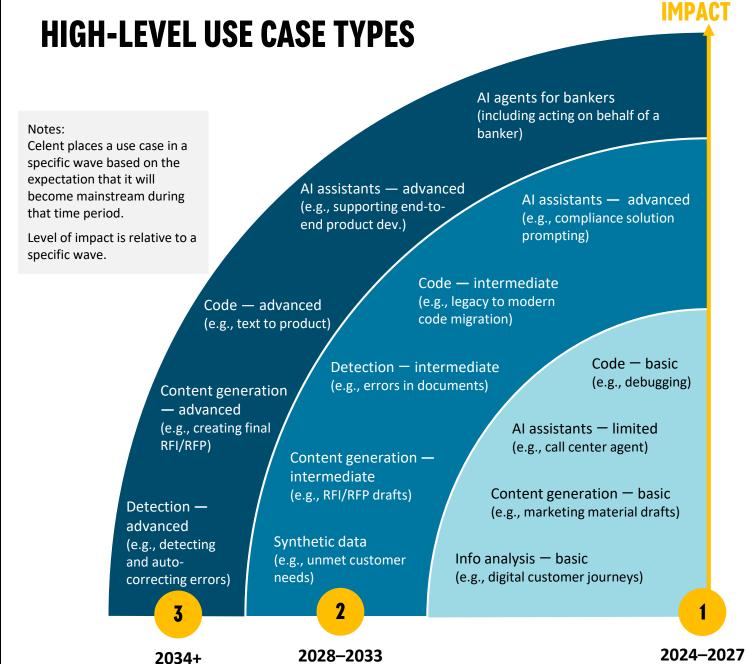
# **COMMON USE CASES: EMPLOYEE-FACING**

Generative AI is an extremely flexible tool that can support employees in myriad areas and levels of sophistication. Celent has arrayed the most promising use cases for each adoption wave. High-level use cases are arrayed on the right. Specific use cases across the value chain are detailed in the next slides. We distinguish three levels of sophistication: basic, intermediate, and advanced.

Wave 1: The overarching theme is pragmatic, i.e., basic use cases that drive operational efficiency and productivity gains.

Wave 2: Frontiers are pushed out to moderate and high-impact use cases that drive revenue growth.

Wave 3: A new world emerges, with humans interacting with Al assistants and "employing" autonomous Al agents on a daily basis.\*



<sup>\*</sup>An Al assistant supports a human. An Al agent acts on behalf of a human based on permissions granted by a human.

### **EMPLOYEE-FACING USE CASES: VALUE CHAIN FRAMEWORK**

To help FIs pinpoint specific use cases to pursue, Celent organizes use cases:

### 1. Along the common value chain



### 2. By high-level use case types

Content generation	Al assistant — automation/decision- making (includes autonomous agents)	Detection models (e.g., errors, fraud) and problem solving	Workflow improvements/redesign/ automation
Content management (e.g., tagging, categorization, compliance, curation)	Code development	Information analysis — including synthesis/summarization	
AI assistant — knowledge source	Data analysis — including augmentation/ visualization	Synthetic data generation	

### 3. By relative impact



High



Medium



Low

For each use case, we assess relative impact. In assigning high (3), medium (2), or low (1), we examine three dimensions: suitability, feasibility, and economic impact. Suitability includes factors such as whether GenAI solves a business problem and/or drives an improvement (or transformation) in banking and capital markets. It also includes regulatory and ethical implications. Feasibility includes the availability and affordability of resources required. Economic impact considers the revenue and productivity drivers outlined in slide 12. Celent makes these assessments based on our analysis of prior technology adoption cycles, proprietary research regarding GenAI, conversations with industry leaders, and survey data from the Celent Vendor use case survey (slide 57).

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### **Product Development & Management**



	Avg.		WAVE		
Use Case Type	Impact	1	2	3	
Content generation		Language translation  Product manuals  Go-to-market plan (first draft)	Product specifications draft  Go-to-market plan (final draft)	Product specifications incorporating data and information analysis that reveals customer needs	
Al assistants — automation/ decision-making		Persona descriptions  Product development	Prototype development  UI and UX design		_
Data analysis — including augmentation/visualization		Demand trend analysis	Customer share of wallet analysis		_
Information analysis — including synthesis/ summarization		Summarization and analysis of customer reviews  Customer survey analysis  Technical product details	Customer behavior analysis		
Synthetic data generation			Granular segment-level feature preferences  Unmet customer needs by segment	Demand simulation based on specific product features	<u></u>

### Sales/Prospecting/Marketing



	Avg.		WAVE		
Use Case Type	Impact	1	2		3
		Language translation for marketing and prospecting documents	Specific marketing material drafts (e.g., for granular segments)		Dynamically generated marketing/ prospecting content for specific
		General marketing material drafts	RFIs/RFPs (final drafts)		customers
Content generation		Prospect lists	Sales training with simulated customer conversations		
		Prospect profiles and email drafts	Conversations		
		RFIs/RFPs (first drafts)			
Content management		Content tagging and categorization	Content curation and workflow		
Al assistants — automation/ decision-making		Sales and prospecting support (e.g., document/info/data retrieval)	Sales and prospecting recommendations	<b>)</b>	Al agents acting on behalf of bankers
Data analysis — including		Demand trend analysis	Customer financial performance		
augmentation/visualization		Customer survey analysis	analysis		
Information analysis — including synthesis/ summarization		Customer behavior analysis (e.g., digital customer journeys)	Analysis of best sales practices	<b>)</b>	

### **Customer Engagement** (support for front-office staff)



	Avg.		WAVE		
Use Case Type	Impact	1	2		3
		Language translation  Email drafts	Automated email responses  Client presentation drafts		Final versions of client documents and presentations
Content generation			(e.g., financial plans)		
			Client contract drafts		
Al assistants — automation/		Next best question guidance for customer service agent	Prescreening of customer queries	3	Al agent for individual bankers that interacts directly with customers
decision-making		castomer service agent	Hybrid banker/AI assistant interactions with customers		(within boundaries)
Al assistants — knowledge source		Information retrieval for customer service agent	In-call AI assistant for bankers/relationship managers		
Detection/problem solving		Contract reviews	Customer attrition signals	<b>)</b>	Problem solving
		CRM content summarization	Contract information extraction and synthesis		
Information analysis —		Call center transcript analysis	Synthesis		
including synthesis/ summarization		Sales call summarization			
		Summarization of research			

Relative Impact:



Medium



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### Risk and Compliance (1/2)



	Avg.			WAVE	
Use Case Type	Impact	1		2	3
Content generation		Repetitive/structured reports (e.g., suspicious activity)  Compliance training material	<b>3</b>	Drafts of responses to regulatory filings  Risk Committee plans and agenda drafts	Final drafts of compliance docs/ regulatory filings
AI assistants — automation/ decision-making		Enhanced monitoring to avoid compliance breaches  Suggestions for rewording correspondence to comply with regulations	3	Suggestions on credit actions based on new information gathered  Automated updates to compliance rules due to e.g., regulatory changes	Supporting end-to-end compliance workflows
AI assistants — knowledge source		Search/synthesis of compliance/legal documents	<u> </u>	Al assistant for natural language querying of compliance data during investigations	
Detection models		Anti-money laundering tools	<b>)</b>	Fraud (e.g., KYC, payments) identification	



Utilizing AI and underlying technologies like AWS Bedrock we will increasingly enable the automation of investigations, allowing resources to be redirected to priority typologies.

Jeremy Butt - Senior Director, Verafin, a Nasdaq Company

## Risk and Compliance (2/2)



	Avg.		WAVE	
Use Case Type	Impact	1	2	3
Information analysis — including synthesis/ summarization		Summarization (e.g., new regulatory requirements and report filings, signals from regulator comments/news, risk review synthesis)  Credit risk analysis scraping and synthesis  Risk review synthesis	Named entity recognition  Entity association map  Signals from news and other data sources that are leading indicators of heightened risk (e.g., cybersecurity)	
Synthetic data generation			Data for extreme scenario analysis  Data for fraud detection models  Textual data generation for compliance testing	
Workflow improvements/ redesign/automation		Natural language changes to risk models (e.g., weights and parameter inputs)  KYC/onboarding prefill	Augmented security master updates	AI agent handling end-to-end compliance processes, with humans handling exceptions only



## Infrastructure (Operations & Technology) (1/2) $\begin{bmatrix} \bar{z} \\ \bar{z} \end{bmatrix}$



	Avg.		WAVE	
Use Case Type	Impact	1	2	3
		Technology documentation draft creation from code	Business plan creation for committee approval	
Content generation		Drafting legal, loan, and trade documentation		
		Code debugging	Technology suggestions (vendors, opensource content, archetypes)	Updating code due to vendor updates or data feed changes
Code development		Code refactoring	Explain legacy code for migrations	
code development		Python VIM clone		
		Draft documentation of systems	Translate legacy code into modern code	
Al assistants — automation/ decision-making		Coding AI assistant suggests code, changes, auto debugging etc.	Al assistants supporting specific processes (e.g., customer onboarding; responding to customer service tickets)	Operations/tech managerial AI assistant — automatic task assignment based on skill, time required, etc.
Al assistants — knowledge source		AI operations assistants – creating dynamic exceptions lists, to do lists		
Data analysis			Transaction/data classification and labeling	







## Infrastructure (Operations & Technology) (2/2)



	Avg.		WAVE	
Use Case Type	Impact	1	2	3
Detection/problem solving		Early warning error detection in documentation with possible solutions	Documentation errors with suggested changes	Auto-correction of errors in documents
Detection/problem solving		Early warning for system malfunction based on user output		
Countly attice data comparations			Data for ML model building	
Synthetic data generation			Data for application testing	
Workflow improvements/		Workflow improvement suggestions based on historical data	GenAl-powered robotics powered automation	Natural language changes to and generation of code base
redesign/automation		Al assistant for workflow creation		Autonomous agents running operations



# COMMON USE CASES: CUSTOMER-FACING

Generative AI will transform how FIs engage with customers. With human-like, conversation-based interactions, customers will be increasingly comfortable interacting with AI assistants and eventually autonomous AI agents.\* Establishing and maintaining trust, however, is paramount.

Wave 1: Use cases will focus on "tell me" interactions, i.e., a customer asks for information.

Wave 2: Use cases that add more value to the customer will grow, i.e., "do it for me" and "advise me" requests.

Wave 3: Use cases will become highly advanced and include customers programming personal banking and/or trading Al agents.

#### **HIGH-LEVEL USE CASE TYPES** Notes: Celent places a use case in a specific wave based on the expectation that it will Al agent — limited become mainstream during (e.g., permitted to undertake that time period. select transactions) Level of impact is relative to a specific wave. Al assistant — advanced (e.g., personalized for individual customer) Al assistant — advanced (e.g., financial wellness coach) Detection/problem solving (e.g., advanced Al agent — very limited (e.g., permitted autocorrection of data entry) to undertake limited, low-risk tasks) Info analysis — advanced Data analysis — (e.g., contract analysis) advanced AI assistant — basic (e.g., personalized Data analysis (e.g., walk through an product suggestions (e.g., personalized product based on bank and third application process) comparison) party data) Info analysis — search and summarization Content generation -(e.g., answers to FAQs) advanced (e.g., bespoke

financial reports)

2028–2033 2034+

(e.g., product guides)

2024-2027

Content generation — basic

<sup>\*</sup>An Al assistant supports a human. An Al agent acts on behalf of a human based on permissions granted by a human.

### **CUSTOMER-FACING USE CASES: VALUE-ADD FRAMEWORK**

To help FIs pinpoint specific use cases to pursue, Celent:

1. Divides use cases into three categories, from relatively low value-add to high value-add for the customer



### 2. Sorts uses cases by high-level type

Content generation	Al assistant — automation/decision-making (includes autonomous agents)	Detection models (e.g., errors, fraud), problem solving	Workflow improvements/redesign/ automation
Content management (e.g., tagging, categorization, compliance, curation)	Code development	Information analysis — including synthesis/summarization	
Al assistant — knowledge source	Data analysis — including augmentation/ visualization	Synthetic data generation	

### 3. Rates use cases by relative impact



Medium



For each use case, we assess relative impact. In assigning high (3), medium (2), and low (1), we examine three dimensions: suitability, feasibility, and economic impact. Suitability includes factors such as whether GenAI solves a business problem and/or drives an improvement (or transformation) in banking and capital markets. It also includes regulatory and ethical implications. Feasibility includes the availability and affordability of resources required. Economic impact considers the revenue and productivity drivers outlined in slide 12. Celent makes these assessments based on our analysis of prior technology adoption cycles, proprietary research regarding GenAI, conversations with industry leaders and survey data from the Celent Vendor use case survey (slide 57).

## Tell Me — Knowledge Transfer



	Avg.	WAVE				
Use Case Type	Impact	1		2		3
Content generation		Language translation  Summarization of bespoke research  Produce how-to guides/FAQs		Creation of personalized content (e.g., market updates, etc.) without user input Personalized product suggestions		
AI assistants — knowledge source		Training for new products/features  Product/feature-finding tool  FAQ answer finder  Natural language data queries (RAG assisted)		Customer onboarding (information)		Celent anticipates that "tell me" use cases will be exhausted by the end of Wave 2.
Information analysis — including synthesis/ summarization				Summarization of research or news		
Data analysis — including augmentation/visualization		Natural language data visualizations				



## Do It for Me — Basic $(\cdot, \cdot)$



	Avg.	WAVE						
Use Case Type	Impact	1	2	3				
Content generation		RAG <sup>1</sup> assisted bespoke reports with public content	Bespoke reports requiring private and sensitive data (regulatory, trade activity, financials, etc.) repeated or ad hoc					
Al assistants — automation/decision-making			Customer onboarding (e.g., autofill)  Personalized/nonstandard forms for standard processes	Basic "do it for me" use cases will be				
Data analysis — including augmentation/visualization		RAG¹ assisted personalized natural language data analysis (e.g., "generate a chart showing my spending in these categories")	Non-RAG assisted personalized natural language information gathering and data analysis	exhausted by Wave 3.				
Information analysis — including synthesis/ summarization			Contract analysis					

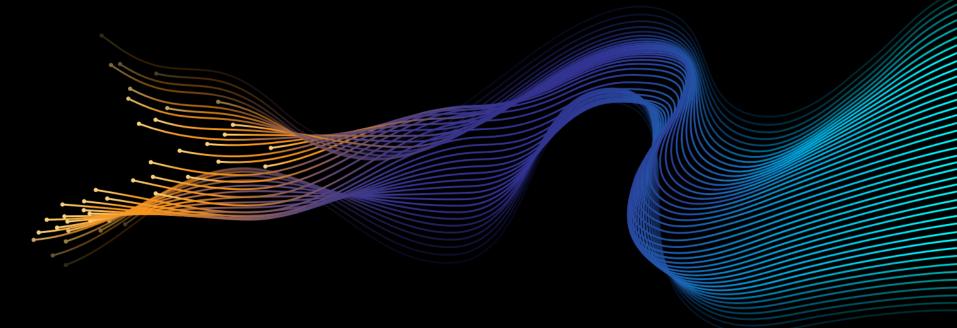




## Advise Me and Do It for Me — Advanced $\mathcal{L}^{\mathbb{Q}}$



	Avg.		WAVE	
Use Case Type	Impact	1	2	3
Content generation			Personalized prescriptive report	
AI assistants — automation/ decision-making		Given the current risks in using GenAl and the heavy regulatory burden around advice in banking and capital markets, we do not anticipate mainstream adoption of direct-to-customer "Advise Me" use cases. More regulatory clarity and model	Personalized engagement  Document input recommendation enhancement  Personalized product suggestions/comparisons  Personalized next best action  Customer onboarding (e.g., recommendations)	Personalized AI assistant for individual customers  GenAI pushes the frontiers of:  • Liquidity optimization advice across accounts and venues  • Hedging optimization/automation
Data analysis		improvements are necessary.	Personalized product recommendations based on bank data	Personalized product recommendations based on third party data
Detection/problem-solving			Solution prompting  Transaction error detection and troubleshooting	GenAl pushes the frontiers of:  • Autocorrecting customer data entry errors  • Automatic problem solving



# USE CASES IN BANKING

# INDUSTRY-SPECIFIC USE CASES

Given product/service and profit lever differences between banking and capital markets, Celent spotlights use cases that are unique to each. We further distinguish use cases by specific lines of business. For banking, we categorize them into retail and corporate banking. For capital markets, we categorize use cases into buy side, sell side, and wealth management lines of business and financial markets infrastructure players (FMIs). In addition, we examine two parts of the value chain unique to capital markets: trading and investment management.



## **CELENT ANALYZES BANKING-SPECIFIC USE CASES**

Following the same framework as for common use cases, Celent spotlights use cases that are specific to retail and corporate banking. These use cases tend to apply to products/services that are unique to these businesses (e.g., credit cards and trade finance).





## **USE CASES UNIQUE TO RETAIL BANKING: EMPLOYEE-FACING (1/2)**

While many inroads have been made to digitize retail banking, there remains room for improvement. GenAl could close the gaps. Employee-facing use cases unique to retail banking tend to be in credit and financial wellness. In particular, for more complex products (e.g., mortgage loans), employees could better serve customers via an AI assistant that can suggest responses and next steps as well as pull relevant information. In addition, synthetic data generation could improve a bank's ability to understand customer needs across segments and enable it to work with anonymized data sets, thereby protecting personally identifiable information (PII).

While credit process automation has advanced notably, there is still room for improvement in accessing and reviewing information. The ultimate use case would be an AI assistant that could support the end-to-end credit process and allow humans to focus on adding value (e.g., customer advice) and handling exceptions.

Use Case Type	Wave	Customer Engagement $\mathring{\Box}\mathring{\Box}$	Risk & Compliance	Infrastructure (Ops & Tech)	
Al assistant automation	2	To assist branch banker and call center agent in credit application  To support credit card customer service in cardholder/merchant disputes	For underwriters to expedite workflows	For middle and back office processes, including booking a loan	
	3	Al assistants that support both customer and bank employees across each phase of the credit application process as neede			
Data analysis — including visualization	2		Image analysis of credit risk exposure by micro segments		

**Relative Impact:** 









## **USE CASES UNIQUE TO RETAIL BANKING: EMPLOYEE-FACING (2/2)**

Use Case Type	Wave	Customer Engagement 🖒 🖒	Risk & Compliance	Infrastructure (Ops & Tech)
Detection models	2		Payment fraud detection	
Synthetic data generation	2	Simulating customer conversations regarding credit products  Using synthetic data in lieu of actual customer data to preserve privacy (e.g., customer preference models)	Providing data for risk scoring models to ensure legal and fair outcomes  Simulating new potential fraud patterns for payments fraud detection models  Recreating existing data sets of sensitive PII with the personal elements removed	

Relative Impact:







Low

## **USE CASES UNIQUE TO RETAIL BANKING: CUSTOMER-FACING**

Similar to employee-facing use cases, customer-facing uses of GenAl are concentrated in credit and financial wellness. The credit application process remains relatively arduous for consumers (especially for mortgage loans), meaning that an AI assistant that can guide the customer and expedite the process would be highly beneficial. Additionally, GenAI could greatly expand the role a bank plays in consumers' financial wellness. Based on a customer's banking data and third party permissioned data, an AI assistant could help advise a customer on how to do things like set a budget and handle an unexpected expense. A bank could also help customers make smarter product choices by tapping into additional data sets.

Use Case Type	Wave	Do It for Me — Basic (:)	Advise Me and Do It for Me — Advanced $ ho^{\mathbb{Q}}$
	2	Automating specific credit application workflows (e.g., auto loans)	Financial wellness coach (e.g., budgeting guidance)
Al assistant automation			Al agent that is programmed/permissioned to manage a customer's financial wellness
	3		Al agent that can undertake credit card product selection and application for a customer
			Al agent that can handle broader queries, e.g., "how can I lower my carbon footprint through my purchases?"
Content generation	2	Personalized spending reports (coupled with transaction classification)	Personalized insights regarding product usage (e.g., maximize credit card rewards)
Data analysis — incl. visualization		Personalized financial insights conveyed via AI assistant based on bank data	Personalized financial insights conveyed via AI assistant based on bank data and permissioned third party data
			Interactive credit score tool that enables customers to determine what actions could improve their score

**Relative Impact:** 









## **USE CASES UNIQUE TO CORPORATE BANKING: EMPLOYEE-FACING (1/2)**

Corporate banking involves many complex processes, myriad systems, and extensive integrations, both internally and with customers' systems. Banks' infrastructure handles trillions of dollars in transactions annually. Exacerbating the complexity are paper-based processes and digital bottlenecks that GenAI can remedy. All assistants that further automate processes (e.g., product development and customization, client onboarding, and credit processes) will drive competitive advantage. More transformative uses cases include using AI assistants to help banks develop customized products for core clients.

In the data realm, banks have yet to tap the full value of payments and related data (e.g., invoices). GenAI could help to unlock that value, allow banks to extend their client support across the entire financial supply chain (accounts payable and receivable), and insert product offerings at the point of need (e.g., a credit offering when a cash shortfall is forecasted).

Use Case Type	Wave	Product Development ①	Customer Engagement 💍 🗍	Risk & Compliance	Infrastructure (Ops & Tech)
AI assistants — automation	2		RFI/RFP generation for cash management  Assisting small business bankers and commercial loan officers in credit application	Credit underwriting and credit memo generation  Fraud checks for trade finance	Middle and back-office processes, including booking a loan
	3	Customized product development based on a corporation's needs and internal systems		nk employees, and relevant third parties (e cess, from data/document gathering to cor	· ·
Code development	2		Faster/better client onboarding , e.g., bank to corporate connectivity		





## **USE CASES UNIQUE TO CORPORATE BANKING: EMPLOYEE-FACING (2/2)**

Use Case Type	Wave	Product Development (	Customer Engagement $\stackrel{\circ}{\cap}\stackrel{\circ}{\cap}$	Risk & Compliance	Infrastructure (op's & tech)
	2	Customized product specifications based on clients' needs and internal	RFI/RFP drafts for cash management services		Credit and trade finance document generation
Content generation		systems	Loan contract generation		
C	3		RFIs/RFPs (final versions)		
Content management	2				Payment transaction data classification and labeling for improved service (e.g., working capital optimization and credit application processing)
Data analysis — including visualization	2		Bespoke reports on the performance of specific commercial clients  Improved client attrition signals thanks to unstructured data		
Detection models	2			B2B payments and trade finance fraud detection models	Error detection in a credit contract
Synthetic data generation	2	For pricing models, e.g., to test price elasticity	Simulating client negotiation for cash management contract	Simulating new potential fraud patterns for B2B payments fraud detection models	

**Relative Impact:** 



Mediu



ow



## **USE CASES UNIQUE TO CORPORATE BANKING: CUSTOMER-FACING (1/2)**

Within their core payments businesses, banks could deliver more "intelligent" services by leveraging AI assistants for not only queries, but also higher-value error prevention/detection/correction. Banks could greatly improve their support of corporations' financial supply chains by providing clients with AI assistants to further digitize and automate their financial supply chains (e.g., providing three-way matching of a purchase order, invoice, and payment). In the long run, GenAI could be the key to delivering "self-driving" treasury.<sup>1</sup>

In addition, unlike most other "suppliers," banks typically embed their services within a corporation's internal systems. Therefore, any improvements in product customization and connectivity/integration that GenAl facilitates by defining product specifications and writing code would be bank differentiators.

Use Case Type	Wave	Tell Me 🔃	Do It for Me — Basic	Advise Me & Do It for Me $-$ Advanced $$
	1	Improved payments-related support services (e.g., expedited answers to status queries)		
AI assistants — knowledge	2	"Financial analyst" for the client (e.g., treasurer), retrieving data and generating figures  "Credit analyst" for the client (e.g., credit file queries)	Payment process set-up Payment process troubleshooting (e.g., "my ACH batch file is not processing")	Product decision-making (e.g., "based on my banking transaction, what's the best?")  Al agent of the relationship manager relays advice regarding liquidity structures, credit mix
Al assistants — automation	2		Improved autocorrection of customer data entry errors (e.g., in a payment initiation)  Support for a client's accounts payable and receivable processes (e.g., three-way matching)  Improved cash concentration	
	3		Support customer in specifying their product requirements, including integration with their internal systems	Al agent that delivers "self-driving" treasury, i.e., automated analysis, decisions, and actions

<sup>1.</sup> Self-driving treasury refers to the automation of treasury tasks/processes to reduce the need for human-involvement. Key technologies include AI/ML, GenAI, and robotic process automation (RPA). The overall objective is to enable treasury teams to focus on higher value-add activities and exceptions/crisis handling.

Sources: Celent interviews, research, surveys, and analysis







## **USE CASES UNIQUE TO CORPORATE BANKING: CUSTOMER-FACING (2/2)**

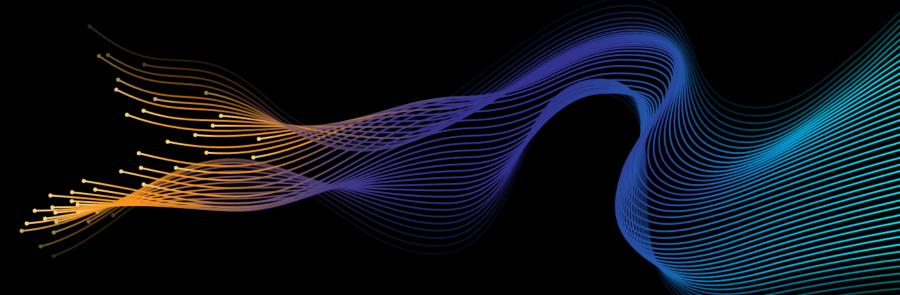
Use Case Type	Wave	Tell Me []	Do It for Me — Basic ♣ ♣	Advise Me & Do It for Me $-$ Advanced $$
Code development	2			Bank leverages its internal GenAI code development expertise and models to support corporate clients (e.g., data and system migrations)
Content generation	2	Customized payments/cash management services guides and training material	Bespoke financial reports	<u> </u>
Data analysis	2	Analysis of payments mix for potential cost improvements		Benchmarking with peers (e.g., working capital performance metrics)
Detection models	2	Payment fraud risk alerts		
Synthetic data generation	3			Macroeconomic or company-level data that powers scenario testing to inform decision-making











# USE CASES IN CAPITAL MARKETS

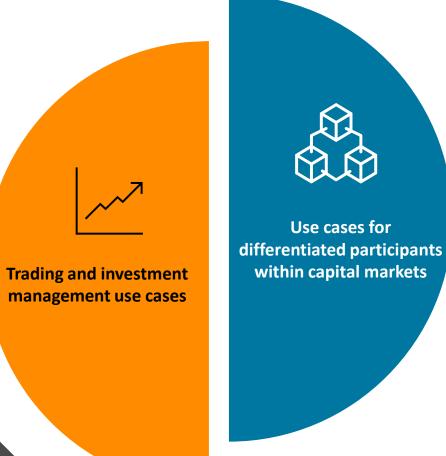
## CELENT ANALYZES CAPITAL MARKETS-SPECIFIC USE CASES ALONG TWO DIMENSIONS

### **Trading and Investment**

Capital markets hold a distinct part of the value chain: trading and investment management. Celent analyzes use cases in this area using the same WaveGram framework used with common use cases. Due to GenAl's ability to synthesize, draw insights, and find patterns across large amounts of multi-modal data, Celent expects GenAl to have a significant impact on trading and investment management after initial hurdles are overcome.

### Position in value chain:





### **Participants**

Within capital markets, there are highly differentiated participants with unique use cases. Celent also finds differences in the level of impact. For example, Al assistants for customer service agents may have more value in wealth management than in the rest of capital markets. Celent analyzed the range of impacts by differentiating between wealth management, buy side, sell side, and financial markets intermediaries (FMIs).

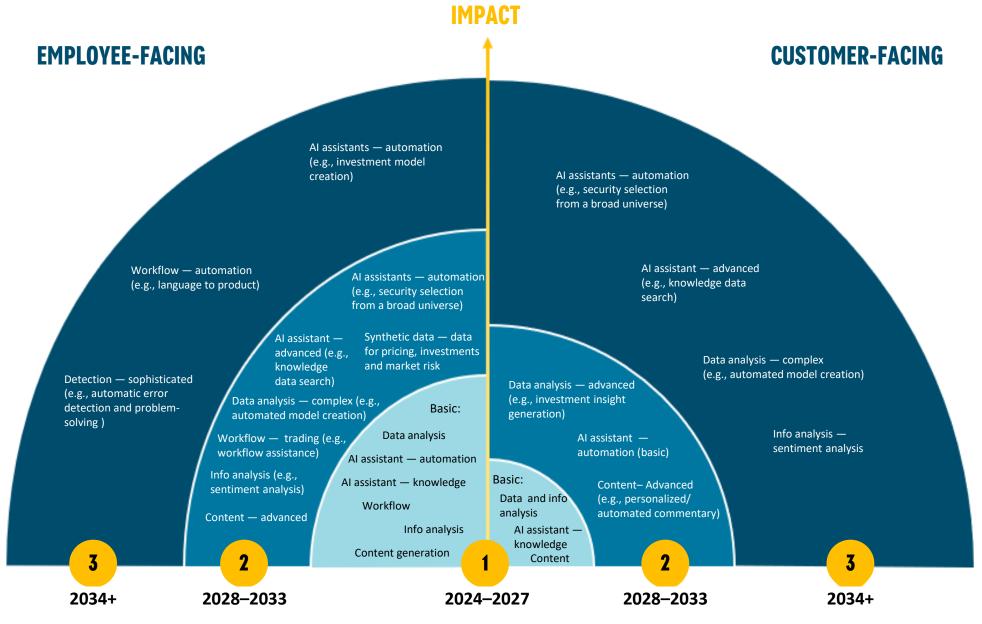
For this analysis, we focus on waves one and two of GenAl adoption. While the third wave will undoubtably create more value, we believe the uncertainty of outcomes does not allow for such a granular analysis.

## TRADING AND INVESTMENT MANAGEMENT: HIGH-LEVEL USE CASES

Celent has arrayed use cases specific to trading and investment management within its WaveGram.

Many applications in the trading and investment management space will first be rolled out internally before being made available to clients to ensure accuracy and regulatory compliance.

As model accuracy and confidence in GenAl outputs grow, Celent expects that capital market participants will act aggressively to realize competitive advantage, fearing a winner-takes-all outcome.



## Trading and Investment Management (1/2)



	Avg.			
Use Case Type	Impact	1	2	3
Content generation		Creation of market commentaries based on selected interests  Creation of summaries of publications with investment implications	Creation of personalized market commentaries	
Synthetic data generation		Data generation for scenario analysis	Data generation for pricing and market risk models  Creation of multiple versions of documents with investment implications for analysis prior to publication (central bank or earnings statements, etc.)	
Data analysis — including augmentation and visualization		Natural language data visualizations Image analysis for ESG (emissions) Image analysis for economic activity Demand trend analysis for investment	Portfolio optimization suggestions/ alternative investment options/ideas  Demand trend analysis for investment direct to clients	
Information analysis — including synthesis/ summarization		Natural language data queries	Sentiment and headline analysis  Market impact studies of textual data with investment implications  Sentiment change outcome suggestions	Sentiment change outcome suggestions (direct to client)

## Trading and Investment Management (2/2)



	Avg.	WAVE				
Use Case Type	Impact	1	2	3		
Al assistants — automation/ decision-making		Natural language model parameter adjustment  Natural language data analysis (e.g., transaction data)	Real-time ESG fact/claim checking tool  Security selection suggestions  Analyst model input suggestions  Natural language creation of complex models/analytics creation/adjustments  Hedge solutions generation	Analyst investment model component determination  Complex model/analytics creation/adjustment (direct to consumer)  Auto hedge for limited products		
Al assistants — knowledge source		Natural language data search using proprietary and public data (RAG assisted)	Natural language data search using proprietary and public data			
Workflow improvements/ redesign/automation		Creation of natural language trading workflows  Natural language trade booking with autofill from multiple sources (chat, voice etc.)	ESG materiality maps  Trading workflow suggestions	Automatic trading workflow creation  Writing smart contracts for deployment on the blockchain using natural language		
Detection/problem solving		Improved early warnings of clearing issues and complex workflows	Suggested problem-solving for complex workflows	Automatic error detection and problem-solving for complex workflows		





## **CELENT DISTINGUISHES USE CASES ACROSS CAPITAL MARKET PARTICIPANTS (1/2)**

Capital markets are not one type of entity, but a number of different entity types that together create an ecosystem. In order to do justice to the diversity of use cases we are likely to encounter, Celent distinguishes between four main types of entities in capital markets. Here we concentrate on the demand side of capital markets, including wealth management (WM) and the buy side.



### **Wealth Management**



### **Buy Side**

### Wealth Management, Private Banking

### Roles:

- Investment advisory
- Portfolio selection
- Financial/estate planning
- Risk and portfolio management

Differentiated focus and impact for WM:

Wealth managers have the greatest need for personalized content generation. They are trying to serve as many clients as possible, all of whom seek personalized financial planning. GenAI use cases that digest and summarize market insights and new product information will also be of high value, as will AI assistants that open up knowledge libraries, initially to advisors and later to clients. Celent believes one first-wave automation possibility is creating personalized talking points for advisors to engage clients and prospects —an example of automation with a human in the loop.

### **Asset Managers, Asset Owners**

### Roles:

- Asset owners/allocation
- Investment research
- Portfolio management

Differentiated focus and impact for the buy side:

With a heavy interest in analysis and a large depository of research data, buy side participants will continue to find value in using GenAl for data analysis, as well as analyst Al assistants that make interacting with and finding data easier. Some areas of the buy side (such as Hedge Funds) will have a lower regulatory burden and a direct path of investment to revenue via tradable insights, making them the most likely front runners of adoption during the Wave 1.

Given compressed clearing timeframes and increasing electronification of markets, workflow automation will also be a target.

	Wealth Management		Buy Side	
Waves	1	2	1	2
Data analysis				
Information analysis				
Content generation				
Synthetic data generation				
Co-pilots — knowledge source				
Workflow improvements/ automation				
Code management/ development				
Error detection/ problem-solving				
Co-pilots — automation /decision-making		•		

## **CELENT DISTINGUISHES USE CASES ACROSS CAPITAL MARKET PARTICIPANTS (2/2)**

The sell side and FMIs create the capital markets ecosystem and facilitate its transactions. The transactions they enable and the interactions they have across products generate a large amount of data that is often unstructured and well suited for GenAI. Additionally, GenAI can assist with much of the technological development that is necessary to both create and upgrade the ecosystem.

	Sell Side		F	FMI	
Waves	1	2	1	2	
Data analysis					
Information analysis					
Content generation		•			
Synthetic data generation					
Co-pilots — knowledge source					
Workflow improvements /automation		•			
Code management/ development			•		
Error detection/ problem-solving					
Co-pilots —automation/decision-making		•	•	•	



### Broker-dealers and banks

### Roles:

- Intermediaries between asset owners and issuers/primary markets
- Secondary market liquidity provision/transaction facilitation

Differentiated focus and impact for the sell side:

With a client base of large, high-value clients with whom companies often have deep relationships including many language-based interactions (chats/phone calls), the sell side will be looking for insights from GenAI into how to serve customers better to increase market share. These players bear a heavy regulatory burden and will be slower to act than others, so Celent expects much of GenAI's value to this group to arise in Wave 2.

As they are under pressure from technology-forward alternative providers as well as regulations, sell side participants will also find value in workflow reconfiguration, code management, regulatory and legal drafting, and investment analysis.



## Exchanges, clearing houses, marketplaces, and data providers

### Roles:

- Central counterparties
- Clearing and settlement
- Payment systems
- Securities and trade repositories
- Data providers

Differentiated focus and impact for FMIs:

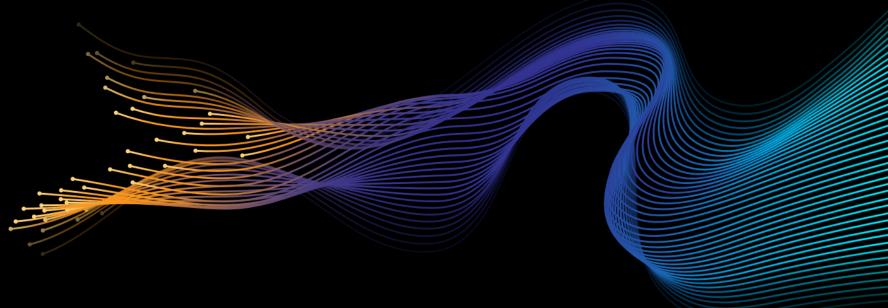
With a different level of regulatory scrutiny and large amounts of data, FMIs are likely to find value in utilizing GenAI for data analysis and AI assistants. This will allow customers to extract more value out of the data and to use the data more easily. Some of these models are already in production via RAG, and it is likely that data analysis will more directly involve GenAI in the future.

Other focus areas are workflow enhancements and error handling.



## THE OVERALL IMPACT ACROSS CAPITAL MARKETS IS POTENTIALLY GROUNDBREAKING

	Capital Markets	Wealth Management	Buy Side	Sell Side	FMIs
Data analysis including augmentation/ visualization					
Information analysis including synthesis/ summarization					
Content generation					
Synthetic data generation					
Al assistants — knowledge source					
Workflow improvements/ redesign/automation					
Code management					
Detection/problem- solving					
Al assistants — automation/decision-making					



# **CONCLUSIONS AND PATH FORWARD**

## **CLOSING THOUGHTS**

	Details	Implications
GenAI tech will evolve faster than other historical tech breakthroughs.	Prior to the emergence of GenAI, many FIs had been using AI for over a decade, meaning they already had experience in the ins and outs of harnessing AI. But GenAI is unlike any other AI breakthrough in terms of its pace of advancement and potential for transformation. It will spur an acceleration in data and tech infrastructure modernization. It will also unleash intense competition amongst FI tech providers. There will be a few brakes on development as regulatory frameworks are set and legal challenges are resolved.	<ul> <li>Fls need to start game planning and learn about their tech providers' GenAl initiatives.</li> <li>They should approach GenAl adoption as a marathon with sprints in between, balancing the drive to adopt with the need to make wise tech and use case choices.</li> <li>They should be patient and committed, since ecosystem development (datasets, models, and applications) takes time and resources. Their commitment to building an ecosystem is vital for a successful move to production.</li> </ul>
Opportunities for scaling and extending are relatively strong.	Despite differences in products/services, banking and capital markets share clients and components of the value chain, giving them common GenAl use cases. As a result, they can leverage successful implementation in one line of business in another.	<ul> <li>FIs should take an enterprise-level view of GenAI adoption and the underlying tech infrastructure modernization it requires.</li> <li>To maximize return, it is imperative to take advantage of resource-, experience-, and cost-sharing across businesses.</li> </ul>
A multiplier effect is expected.	Many use case types (e.g., Al assistants) show potential to move from low-impact to high-impact applications as models improve, costs decline, and risks are mitigated. Experience drawn from initial use cases will prove highly valuable in implementing and scaling higher-value use cases when they become feasible (e.g., the migration from customer Al assistants that "do it for me" to those that "advise me").	<ul> <li>FIs should not wait until the GenAl frontier is pushed out, but rather identify promising current use cases to explore.</li> <li>Successful ecosystem development will pay dividends by enabling easier and faster adoption of higher-value use cases.</li> </ul>

Source: Celent research, interviews, and analysis.

## **THE WAVES: PATH FORWARD**

Celent's WaveGram allows us to look past the current situation of high potential but uncertain outcomes to determine the future state of GenAI.

<b>ADOPTION WAVE</b>	PATH FORWARD
1 2024-2027	Despite the uncertainty surrounding regulation and risks, FIs need to invest today to establish the organizational dynamic and infrastructure to support GenAl adoption. FIs that stand on the sidelines are at risk of competitive disadvantage. During Wave 1, the GenAl ecosystem will mature and many capital markets and banking participants will bring several use cases into production. These early movers and fast followers will benefit from momentum in their next use cases. Therefore, Celent encourages all FIs to examine low-risk use cases and identify at least four to explore and at least one to move into production. We counsel FIs to be prepared for nonlinear development and ebbs and flows as breakthroughs — either organizational or technological — are needed.
2 2028-2033	The competitive GenAl game will not be over in Wave 1. During Wave 2, capital markets and banking players still have an opportunity to reach their full GenAl potential.  Celent advises FIs to be ready for an acceleration of use case deployment. We anticipate that the ecosystem will reach maturity and technological advances will push out the use case frontier. Use cases will no longer be concentrated in standalone applications but instead will extend across value chains and workflows. To take advantage of new opportunities, FI will have to dedicate more resources at both the enterprise and business levels and galvanize greater organizational buy-in than in Wave 1. Steady investment in enhancing the AI platform and ensuring enterprise knowledge sharing will remain vital to building on top of previous models and implementations.
3 2034+	Celent's recommendations to FIs for Waves 1 and 2 pay dividends in Wave 3. GenAl value creation will likely not be tapped out by 2034. While most use cases generating low to moderate value will likely have been implemented, additional high-value use cases (e.g., entire workflows are driven by Al agents) will remain. Releasing some of the more creative features of GenAl, there is a potential for GenAl to develop completely new features, products and income streams that we can not imagine today. The feasibility of implementing these use cases for an FI will depend on the GenAl capabilities it has built and the risk mitigation it has achieved over the past decade. The playing field will not be level and select FIs will clearly be in the lead.

## CAPITAL MARKETS AND BANKING LEADERS ARE THINKING IN THE LONG TERM WITH

**WAVE 2 AND EVEN WAVE 3 IN SIGHT** 



Currently, it's all based on human decisions, but the next iteration of this could be where we move the risk paradigm and start performing actions on it.

Erin Stanton, Global Head of Portfolio and Trading Analytic Client Support, Virtu Financial, "Generative Al gaining traction in derivatives markets", FIA, Oct 2023





Many of the things we're doing at NatWest [with GenAI]... help us take out costs, become more efficient, do our jobs better, but the differentiators feel like things where the stochastic parrot can come up with an idea we haven't ever seen before.

Zachery Anderson, Chief Data & Analytics Officer, Natwest Group, <u>AWS re:Invent 2023 -</u> How to deliver business value in financial services with generative AI, Nov 2023

# CELENT RESEARCH



## **CELENT'S GENERATIVE AI RESEARCH IS EXTENSIVE KEEPING PACE WITH ADVANCES AND OPPORTUNITIES**

### **Celent's Report Series**



### 1st Edition — March



### 2<sup>nd</sup> Edition — July/Aug.



### 3<sup>rd</sup> Edition — Dec.

ChatGPT and Other Large Language Models: Banking Edition

ChatGPT and Other Large Language Models: Wealth Management Edition

ChatGPT and Other Large Language Models: P&C, Life, and Health Insurance Edition

Generative AI: Mitigating Risk to Realize Success in Banking

Generative AI: Mitigating Risk to Realize Success in P&C Insurance

Generative AI: Mitigating Risk to Realize Success in Life Insurance GenAI: Lens on Use Cases in Capital Markets

GenAI - Lens on Use Cases in Corporate Banking

GenAI - Lens on Use Cases in Retail Banking

GenAI - Lens on Use Cases In Life Insurance

GenAI - Lens on Use Cases in P&C Insurance

4<sup>th</sup> Edition — Q2 2024

Generative Al-oneers: FI Survey and Showcase

(working title)

### In addition to our ongoing report series, we have in-depth coverage of the rapid progression of LLMs:

### Q1 2023

GPT-4 and Other News: Tomorrow Is Today

ChatGPT and Other Large Language Models: What Non-techies Need to Know

### Q2 2023

LLMs, Learning, and the Value of Toil

Generative AI and Large Language Models: A Snap Poll for the Celent Executive Panel

Should I Build Mv Own ChatGPT?

A Guide to Determining Best Fit LLMs

HSBC AI Global Tactical Index

### Q3 2023

Artificial Intelligence: A Key Theme of Insurtech Insights in NYC

A Brief Video Explainer on Large Language Models

Beyond Human Intelligence: Unleashing The Power of LLMs in Life Ins

BondGPT: Supporting Fixed Income Trading and Analytics with Generative AI

### Q4 2023

GenAI: Turbocharging AI in Capital Markets

Responsible Innovation: The Implications of AI and Regulation

Q1 2024

Generative AI in Capital Markets Roundtable Summary

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