

THE STATE OF FRAUD AND FINANCIAL CRIME IN THE U.S. 2023

September 2023 Report



HAWK

THE STATE OF FRAUD AND FINANCIAL CRIME IN THE U.S. 2023

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The State of Fraud and Financial Crime in the U.S. 2023 was produced in collaboration with Hawk, and PYMNTS Intelligence is grateful for the company's support and insight. PYMNTS Intelligence retains full editorial control over the following findings, methodology and data analysis.

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WHAT'S AT STAKE

inancial institutions (FIs) continue to experience increasingly sophisticated fraud and financial crime. The rise of digital banking and ever-faster digital payment methods have accelerated this phenomenon. As a result, banks have had to elevate their systems and processes to find ways to stem the growth in fraudulent transactions — and the resulting uptick in financial losses. PYMNTS Intelligence finds that compared to 2022, 43% of FIs have experienced increased fraud. The average cost of fraud for FIs with assets of \$5 billion or more also increased by 65%, from \$2.3 million in 2022 to \$3.8 million in 2023.

To better identify and assess the types of fraud banks most commonly experience, we used the Federal Reserve's Fraud Classifier Model, which provides a standardized and holistic picture of fraud for all FIs. Misuse of account information is still

43%



of U.S. financial institutions reported increases in fraudulent transactions this year.

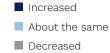
the leading source of fraud, accounting for 38% of fraudulent transactions. Digital wallets, such as Samsung Pay, Google Pay and Apple Pay, exhibited the most significant increases in fraud rates since 2022, as do same-day automated clearing house (ACH) and regular ACH payments. To combat growing fraud, FIs are increasing investments and deployments of machine learning (ML) and artificial intelligence (AI), which FIs already recognize as powerful tools in stemming fraudulent transactions.

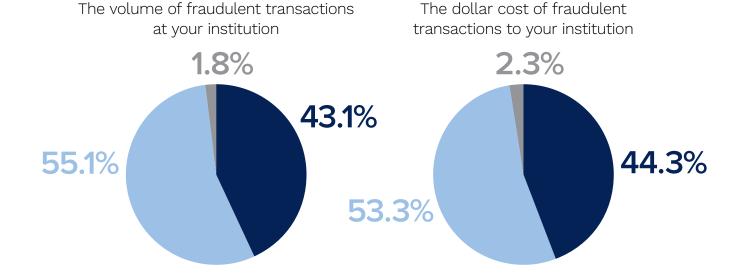
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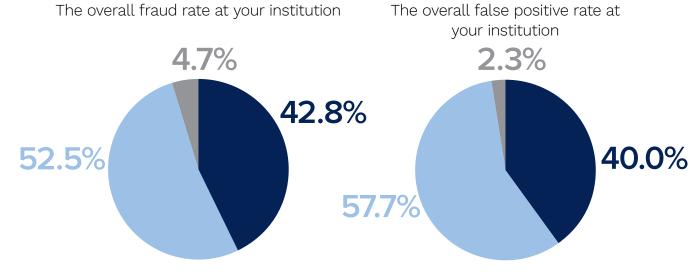
FIGURE 1:

Changes in fraud

Share of FIs with assets totaling more than \$5 billion that cite experiencing select changes in fraud and financial crime in 2023 versus 2022







Source: PYMNTS Intelligence

The State of Fraud and Financial Crime in the U.S. 2023, September 2023 N = 200: Complete responses, fielded March 20, 2023 – June 16, 2023

The State of Fraud and Financial Crime in the U.S. 2023, a PYMNTS Intelligence and Hawk collaboration, examines the state of fraud and financial crime FIs experienced in 2023 compared to 2022, including the rising costs of fraud and what actions they have taken to mitigate fraud. We collected 200 responses from executives working at FIs with assets of at least \$1 billion between March 29 and June 16. Respondents were also part of our 2022 survey on fraud FIs experienced. In 2022, all sampled FIs had assets totaling more than \$5 billion. In 2023, sampled FIs included 108 FIs with assets totaling more than \$5 billion and 92 FIs with assets between \$1 billion and \$5 billion. Respondents were executives with deep knowledge and leadership responsibilities in the following areas: fraud and risk operations, fraud strategy or fraud analysis.

This is what we learned.









KEY FINDINGS





More than 40% of banks in the U.S. experienced an increase in fraud relative to 2022, resulting in more fraudulent transactions and fraud losses increasing by about 65%. Last year, 70% of FIs reported an increase in fraud relative to 2021.



Share of FIs with assets of more than \$5 billion that saw no change in the volume of fraudulent transactions in 2023



While account information misuse is still the leading type of fraud, each FI lost, on average, nearly half a million dollars related to scams in 2023.

Share of fraudulent transactions from scams, with bank tech support impersonation and IRS scams most common



ADVANCED TECH

FIs have invested in technologies such as ML and AI to address the increase in fraud, yet smaller FIs still lag in adoption.



Share of FIs that currently use ML and AI technologies to combat fraud, up from 34% in 2022



Most FIs are already adding or will add ML and AI technologies to combat fraud in the next year and are shifting from outsourcing to in-house solution development.



Share of FIs that either are in the process of adding or will add new tech systems to combat fraud in the next year

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IN DEPTH

Fraud and financial crimes are still rising, and FIs are increasing investments in advanced ML and AI technologies in response.

More than 40% of banks in the U.S. experienced an increase in fraud relative to 2022 figures — the uptick resulted in a higher number of fraudulent transactions and fraud losses increasing by about 65%.¹ Last year, 70% of FIs reported an increase in fraud relative to 2021.

Fraud remains a top challenge, even as fraud rates have remained stable for many FIs in 2023 relative to 2022 figures — a year in which nearly three-quarters of FIs experienced increased fraud. Approximately 55% of sampled institutions report that all fraud measurements remained constant in 2023 versus 2022, while roughly 44% of FIs report that all fraud measurements increased in 2023. For example, 43% of FIs report experiencing an increase

Our sample covers FIs in the United States with assets of at least \$1 billion, representing 15% of all FIs in the U.S. but covering 93% of banks' assets.

in fraudulent transactions in 2023 — and larger FIs are more likely to have experienced increases in the volume of fraudulent transactions. While 63% of FIs with assets of more than \$100 billion saw an increased volume of fraudulent transactions, just 30% of FIs with assets between \$1 billion and \$5 billion experienced this.

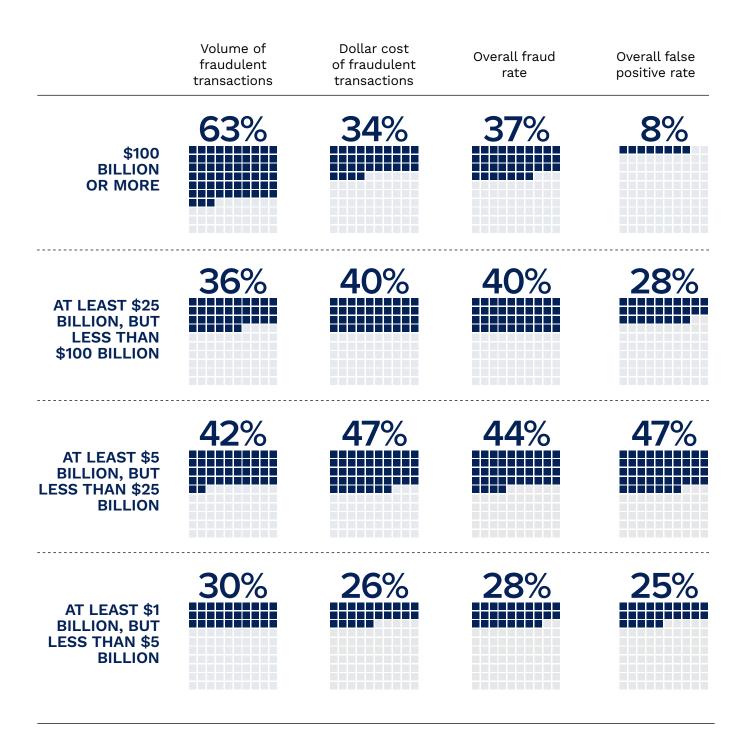
An increase in the volume of fraudulent transactions can correspond to a rise in the cost of these transactions, and our data finds that among FIs with assets of more than \$5 billion, the share of transactions resulting in fraud losses increased from 1.6 basis points in 2022 to 1.9 in 2023. Larger FIs experienced the highest increases.² The total losses for all FIs in our sample was \$3 billion, yet FIs with assets of at least \$5 billion each spend, on average, \$11 million combating fraud. Of this, \$3.8 million covers losses due to fraudulent transactions, up from \$2.3 million in 2022 — a 65% increase. FIs spent the rest of this total on investing in staffing and technological resources and outsourcing services to combat fraud.

As there are 333 FIs in the U.S. with assets of at least \$5 billion, the total losses due to fraudulent transactions for these FIs added up to more than \$1.3 billion in 2023, nearly doubling the \$767 million lost in 2022. For the 1,053 FIs in the U.S. with assets between \$1 billion and \$5 billion, each lost \$1.4 million on average — a collective total of \$1.4 billion.

FIGURE 2:

Firms experiencing increasing fraud

Share of firms that experienced an increase in select fraud metrics in 2023, by asset size



Source: PYMNTS Intelligence

The State of Fraud and Financial Crime in the U.S. 2023, September 2023 N = 200: Complete responses, fielded March 20, 2023 – June 16, 2023

² Note: Data for FIs with assets between \$1 billion and \$5 billion is not included in time comparison charts.

FIGURE 3A:3

Fraud losses

Share of transactions (in basis points) resulting in fraud losses in the last 12 months among firms with assets totaling more than \$5 billion, by year

> 2023 2022

SAMPLE



\$100 BILLION OR MORE



AT LEAST \$25 BILLION BUT **LESS THAN \$100 BILLION**



AT LEAST \$5 BILLION BUT **LESS THAN \$25 BILLION**



AT LEAST \$1 BILLION BUT **LESS THAN \$5 BILLION**

> Source: PYMNTS Intelligence The State of Fraud and Financial Crime in the U.S. 2023, September 2023 N = 200: Complete responses, fielded March 20, 2023 - June 16, 2023

FIGURE 3B:

Fraud losses

Average cost of fraud related to fraudulent transactions experienced among firms with assets totaling more than \$5 billion, by year

> 2023 2022

SAMPLE



\$100 BILLION OR MORE



AT LEAST \$25 BILLION BUT **LESS THAN \$100 BILLION**



AT LEAST \$5 BILLION BUT **LESS THAN \$25 BILLION**



AT LEAST \$1 BILLION BUT **LESS THAN \$5 BILLION**



Source: PYMNTS Intelligence

The State of Fraud and Financial Crime in the U.S. 2023, September 2023 N = 200: Complete responses, fielded March 20, 2023 - June 16, 2023

FIGURE 3C:

Fraud losses

Average total cost of fraud not related to fraudulent transactions in the last 12 months experienced among firms with assets totaling more than \$5 billion, by year

> 2023 2022

SAMPLE



\$100 BILLION OR MORE



AT LEAST \$25 BILLION BUT **LESS THAN \$100 BILLION**



AT LEAST \$5 BILLION BUT **LESS THAN \$25 BILLION**



AT LEAST \$1 BILLION BUT **LESS THAN \$5 BILLION**



Source: PYMNTS Intelligence

The State of Fraud and Financial Crime in the U.S. 2023, September 2023 N = 200: Complete responses, fielded March 20, 2023 - June 16, 2023

³ When referring to time comparison data, we use data for FIs with assets of at least \$5 billion, representing 4% of all FIs in the U.S. but covering 85% of banks' assets.

While misuse of account information is still the leading type of fraud, each FI lost nearly half a million dollars, on average, related to scams alone in 2023.

Using the Federal Reserve's Fraud Classifier Model, PYMNTS Intelligence finds that rates of unauthorized fraud surpass authorized fraud for all FIs, with 63% of fraudulent transactions coming from unauthorized party fraud — the type of fraud that occurs when external actors take over or compromise credentials to commit fraud. The misuse of account information — consisting of digital payment fraud and physical forgery — remains the leading source of fraud, with each FI losing an average of \$1.4 million to this scheme in the last year. Authorized fraud, in which bad actors manipulate internal individuals to commit fraud in the form of scams, including relationship, trust fraud and product or services fraud, represents just 12% of fraudulent transactions, yet each FI lost an average of nearly half a million dollars due to scams this year.

The most common scams of late have been IRS imposter scams, a form of relationship or trust fraud 22% of FIs experienced, and bank tech support impersonation, a form of product or services fraud 20% of FIs experienced in the past year. Relationship and trust fraud scams decreased to 6% in 2023 from 12% in 2022, suggesting that banks have found ways to mitigate this kind of scam.

Digital payment fraud rates rose with most payment methods accepted by FIs, and digital wallets such as Samsung Pay, Google Pay and Apple Pay exhibited the highest increases. For instance, 65% of FIs that accept Samsung Pay experienced increased fraud rates in 2023, up from 27% in 2022. Same-day ACH and regular ACH payments also experienced notable increases in fraud. From 2022 to 2023, the share of firms that experienced an increase in payments made via same-day ACH increased by 35 percentage points. The increased speed of payment transactions contributed to these dramatic increases in digital payment fraud.

FIGURE 4A:4

7.8%

11.1%

Leading sources of fraud

Fraud classifier model: Share of fraudulent transactions (based on total dollar value) among FIs with assets totaling more than \$5 billion, by year⁵



UNAUTHORIZED PARTY

MISUSED ACCOUNT INFO

Physical forgery/counterfeit 11.3%



ACCOUNT TAKEOVER

Impersonated authorized party



AUTHORIZED PARTY

UNAUTHORIZED PARTY MODIFIED PAYMENT INFORMATION

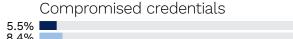
Physical alteration 4.3%

3.7%

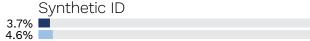
5.5%



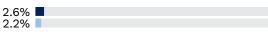




AUTHORIZED PARTY ACTED FRAUDULENTLY



False claim

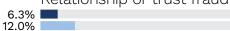


Embezzlement

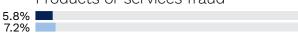


AUTHORIZED PARTY WAS MANIPULATED —





Products or services fraud



Source: PYMNTS Intelligence

The State of Fraud and Financial Crime in the U.S. 2023, September 2023 N = 200: Complete responses, fielded March 20, 2023 - June 16, 2023

FIGURE 4B:

Leading sources of fraud

Fraud classifier model: Average total losses (in millions) related to fraudulent transactions, based on total dollar value among firms with assets totaling more than \$5 billion, by year

- 2023
- 2022

UNAUTHORIZED PARTY

MISUSED ACCOUNT INFO

Physical forgery/counterfeit

\$0.4M

\$0.2M

Digital payment

\$1.0M

\$0.5M

ACCOUNT TAKEOVER

Impersonated authorized party

\$0.5M

\$0.3M

Compromised credentials

\$0.4M

\$0.2M

AUTHORIZED PARTY

UNAUTHORIZED PARTY MODIFIED PAYMENT INFORMATION

Physical alteration

\$0.2M

\$0.1M

Impersonated authorized party

\$0.2M

\$0.2M

Compromised credentials

\$0.2M

\$0.2M

AUTHORIZED PARTY ACTED FRAUDULENTLY

Synthetic ID

\$0.1M

\$0.1M

False claim

\$01M

\$0.1M

Embezzlement

\$01M

\$0.1M

AUTHORIZED PARTY WAS MANIPULATED —

Relationship or trust fraud

\$0.2M

\$0.3M

Products or services fraud

\$0.2M

\$0.2M

Source: PYMNTS Intelligence

The State of Fraud and Financial Crime in the U.S. 2023, September 2023 N = 200: Complete responses, fielded March 20, 2023 - June 16, 2023

⁴ Note: Data for FIs with assets between \$1 billion and \$5 billion is not included in time comparison charts.

⁵The Federal Reserve developed the Fraud Classifier Model to help address the industry-wide challenge of inconsistent classifications for fraud. The advantage of this model is the ability to classify fraud independently of payment type, channel or any other characteristics. This model starts with who initiated the payment, how they acted and the final type of fraud.

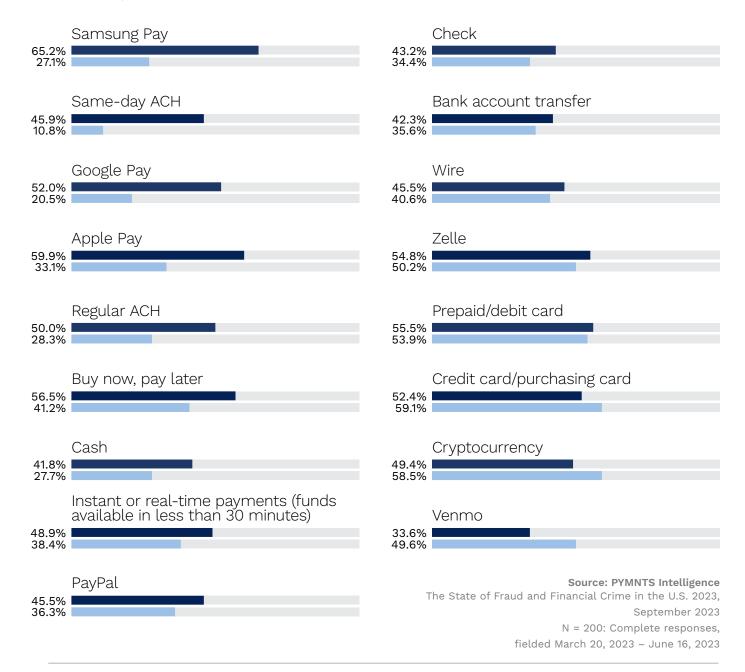
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FIGURE 5A:

Fraud and payment methods 6

Share of FIs with assets totaling more than \$5 billion experiencing increased fraud across payment methods, by year



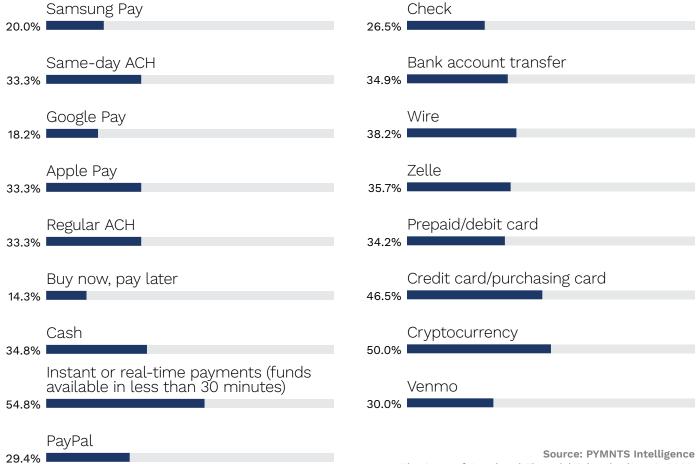


⁶ Note: Data for FIs with assets between \$1 billion and \$5 billion is not included in time comparison charts.

FIGURE 5B:

Fraud and payment methods

Share of FIs with assets of up to \$5 billion experiencing increased fraud across payment methods, by year



The State of Fraud and Financial Crime in the U.S. 2023. September 2023

N = 200: Complete responses,

fielded March 20, 2023 - June 16, 2023



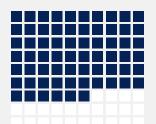
Share of FIs not using ML/AI technologies that **faced increased fraud**

FIs have invested in ML and AI to address the increase in fraud, yet smaller FIs lag in adopting these modern technologies.

Rules-based algorithms, ML and AI are the technologies most used to combat fraud, especially among larger banks. In 2023, 60% of FIs report using rules-based algorithms to combat fraud, up from 50% in 2022. At least 66% of FIs with more than \$5 billion in assets use ML and AI, exceeding the 44% of smaller FIs that do the same. Meanwhile, fraud scores and fraud prevention application programming interfaces (APIs) are falling out of favor, as fewer FIs now report using these technologies, at 50% compared to 65% in 2022. Approximately 4 in 10 banks with assets of more than \$25 billion currently use these APIs. Smaller FIs are hanging on, with 55% of FIs with less than \$5 billion in assets still utilizing these technologies.

FIS using ML or AI also report lower rates of the two most common scams: 22% of FIs not using these technologies experienced bank tech-support impersonation scams, but just 18% of those using these ML or AI faced the same scams. Likewise, 24% of FIs not using the technology experienced IRS imposter scams, compared to 20% of FIs using them.

FIs that leverage ML/AI to combat fraud are significantly less likely to report that their overall fraud rate increased in 2023 than those not using these technologies. While 26% of FIs using these technologies faced increased fraud, 34% of FIs not using ML/AI reported the same.



Share of FIs with assets over \$5 billion that are using ML/AI technologies in 2023

Advanced ML and AI technologies identify anomalies in authorized user profiles and block bad actors before they reach their targets, resulting in fewer fraud incidents. One drawback is that the expense of deploying these systems, even with fewer incidents, can increase the cost of fraud — at least in the short term.

FIGURE 6A

Fraud-fighting technologies

Share of FIs citing select technologies currently used to combat fraud and financial crimes, by size

		Sample	\$100 billion or more	\$100 billion or more	At least \$5 billion but less than \$25 billion	At least \$1 billion but less than \$5 billion
•	Rules-based algorithm	59.9%	31.6%	81.8%	60.0%	59.8%
•	ML/AI	48.8%	97.3%	45.5%	65.5%	43.5%
•	Fraud prevention APIs	54.1%	40.7%	42.4%	52.7%	55.4%
•	Cloud-based fraud and financial crimes platform	47.7%	52.7%	39.4%	34.5%	51.1%
•	Fraud scores provided by payments processor	42.0%	23.7%	24.2%	14.5%	50.0%
•	Rely entirely on manual processes	2.5%	0.0%	0.0%	0.0%	3.3%

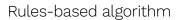
Source: PYMNTS Intelligence

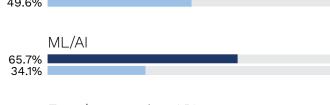
The State of Fraud and Financial Crime in the U.S. 2023, September 2023 N = 200: Complete responses, fielded March 20, 2023 - June 16, 2023 **FIGURE 6B:**

Fraud-fighting technologies⁷

Share of FIs with assets of up to \$5 billion citing select technologies currently used to combat fraud and financial crimes, by year





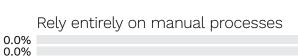


Fraud prevention APIs









Source: PYMNTS Intelligence

The State of Fraud and Financial Crime in the U.S. 2023, N = 200: Complete responses,

fielded March 20, 2023 - June 16, 2023

70.0%

⁷ Note: Data for FIs with assets between \$1 billion and \$5 billion is not included in time comparison

FIGURE 7A:

ML and AI technologies' fraud impact

Average share of select fraud measures and costs, by use of ML and AI

Share of overall costs of fraud accounted for by losses due to fraudulent transactions

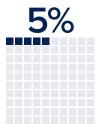
Percentage of transactions (in basis points) that resulted in fraud losses

Total cost of fraud

Cost of fraud losses due to fraudulent transactions

DO NOT CURRENTLY USE ML OR AI



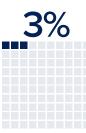
















Source: PYMNTS Intelligence

The State of Fraud and Financial Crime in the U.S. 2023, September 2023 N = 200: Complete responses, fielded March 20, 2023 - June 16, 2023

FIGURE 7B:

ML and AI technologies' fraud impact

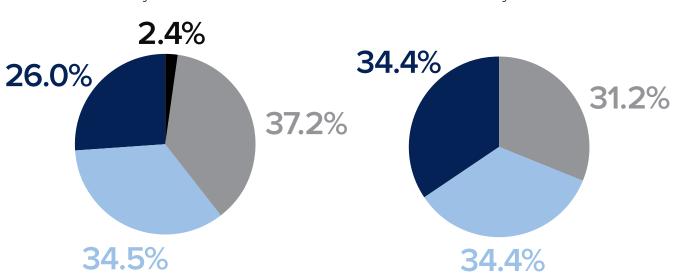
Share of FIs citing changes in overall fraud rate experienced in 2023 versus 2022, by use of ML and Al



- Stayed about the same
- Significantly or somewhat decreased
- Not sure



Do not currently use ML or Al



Source: PYMNTS Intelligence

The State of Fraud and Financial Crime in the U.S. 2023, September 2023 N = 200: Complete responses, fielded March 20, 2023 - June 16, 2023 30 | The State of Fraud and Financial Crime in the U.S. 2023

Most FIs are adding or will add ML and AI technologies to combat fraud in the next year — and rather than outsourcing fraud detection and protection, they are moving to develop solutions in-house

The battle against rising fraud never ends, and banks of all sizes need more sophisticated tools to win the fight. Our study finds that 48% of FIs are either in the process of adding or will add new technology systems in the next year — especially the largest banks. Among FIs with assets of \$100 billion or more, 26% have begun adding new technologies, and 68% will do so in the next 12 months. In contrast, just 2.2% of FIs with assets of less than \$5 billion are adding new technologies, and 35% will do so in the next 12 months.

Improving existing technology solutions Share of FIs planning to add new technologies, by asset size

Sample

■ We are already in the process of adding new technology systems

■ We will add new technology systems in the next 12 months



At least \$1 billion, but less than \$5 billion

DILION 2.2% ■ 34.8%

The State of Fraud and Financial Crime in the U.S. 2023, September 2023

N = 200: Complete responses, fielded March 20, 2023 – June 16, 2023

Source: PYMNTS Intelligence

Still, more FIs recognize ML and AI as the most effective technologies to combat fraud and mitigate fraud losses. This year, 56% of FIs with more than \$5 million in assets reported plans to initiate or increase their use of ML and AI to improve existing fraud solutions, whereas 36% had these plans in 2022.

Traditionally, FIs have sourced their efforts to improve fraud detection and protection solutions. Our study finds that outsourcing is now the least popular option, with just small FIs interested in pursuing this path to improve existing solutions. While 42% of FIs with assets of less than \$5 billion plan to outsource to a third party, just 5.3% of FIs with assets of \$100 billion or more plan to do so. FIs are instead more apt to develop new in-house systems to combat fraud, with this share increasing significantly in the past 32 | The State of Fraud and Financial Crime in the U.S. 2023

FIGURE 9A: How FIs plan to improve anti-fraud efforts

Share of FIs planning select actions to improve existing fraud solutions, by size

	\$100 billion or more	At least \$25 billion, but less than \$100 billion	At least \$5 billion, but less than \$25 billion	At least \$1 billion, but less than \$5 billion
Improved communication with customers	51.3%	60.6%	63.6%	68.5%
• Initiating or increasing the use of ML/AI models	71.0%	54.5%	54.5%	50.0%
Initiating or increasing the use of cloud-based fraud and financial crimes platforms	25.0%	48.5%	58.2%	55.4%
• Developing new in-house systems for fraud and financial crimes	52.7%	45.5%	45.5%	43.5%
• Initiating or increasing the use of deep learning systems	69.7%	45.5%	43.6%	46.7%
 Outsourcing the detection and prevention of fraud and financial crimes to a third party 	5.3%	21.2%	18.2%	42.4%
Have no plans to improve our current solutions for fraud and financial crimes	1.3%	3.0%	0.0%	2.2%

Source: PYMNTS Intelligence

The State of Fraud and Financial Crime in the U.S. 2023, September 2023 N = 200: Complete responses, fielded March 20, 2023 - June 16, 2023

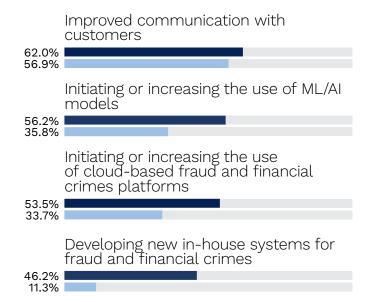
year. In 2023, 46% of FIs with assets totaling more than \$5 billion cite developing new in-house systems to improve existing fraud solutions, compared to 11% in 2022. At 53%, FIs with assets of \$100 billion or more are the most likely to cite plans to develop new in-house systems to improve existing fraud solutions.

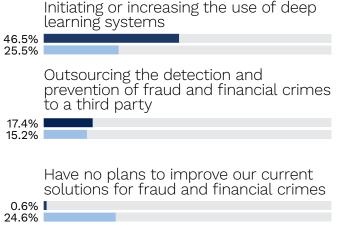
FIGURE 9B:

How FIs plan to improve anti-fraud efforts

Share of FIs planning to add new technologies, by asset size







Source: PYMNTS Intelligence

The State of Fraud and Financial Crime in the U.S. 2023, September 2023

N = 200: Complete responses, fielded March 20, 2023 - June 16, 2023 | The State of Fraud and Financial Crime in the U.S. 2023 Data Focus | 35

DATA FOCUS

Data breaches, complex regulatory requirements and the increased speed of payments are FIs' biggest challenges in the face of rising fraud.

FIs face more challenges when combating fraud, including fending off increasingly sophisticated cyberattacks, handling faster payment rails and a stiffer regulatory environment

Data breaches, increased speed of payment and complex regulatory requirements are the top challenges FIs say they face when combating fraud. In particular, the share of FIs with assets totaling more than \$5 billion that mention data breaches and the increased speed of payments as their top challenges rose significantly in 2023 compared to 2022. In 2023, 16% of FIs cite cyberattacks and data breaches as a top challenge, doubling the 7.7% share that said the same in 2022. This year, 14% cited increased speed of payments as their top challenge, while just 3.7% said this in 2022.

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PYMNTS INTELLIGENCE

HAWK

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808

89

23

1176

700

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23

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1176

The share of FIs citing complex regulatory requirements as their top challenge decreased significantly this year, as did the share of FIs citing the increasing sophistication and growing number of fraud and financial crimes. What dropped the most — from 16% in 2022 to 4.2% in 2023 — is the share of FIs citing the cost of deploying new technologies to combat fraud as their biggest challenge. This 74% decrease suggests that FIs increasingly recognize the necessity of adopting advanced anti-fraud solutions and are willing to make the investment. This may stem from the growing concerns FIs have about losing customers and revenue due to fraud and financial crime, with 9.3% of FIs citing loss of customers and revenue due to fraud and financial crime as their biggest challenge. Just 1.5% said the same in 2022.



Share of FIs with assets over \$5 billion citing the loss of customers and revenue due to fraud and financial crime as their biggest challenge in 2023

FIGURE 10:8

FIs' top fraud-fighting challenges

Share of FIs with assets totaling more than \$5 billion that cite select challenges as their top challenge in combating fraud, by year

2023

2022



Source: PYMNTS Intelligence

The State of Fraud and Financial Crime in the U.S. 2023 N = 200: Complete responses, fielded March 20, 2023 - June 16, 2023 **COST OF COMBATING FRAUD**

Financial sanctions compliance

4.7%

Cost to the bank for reimbursing fraud-related losses

7.9%

Cost of adopting new technologies to better combat fraud and financial crimes

Organizational design (e.g., operational silos or organization size)

4.7%

ORGANIZATIONAL LIMITATIONS

Inability of current solutions to identify fraudulent transactions

2.7%

Inability of our system to integrate with new solutions to identify and block fraud and financial crimes

2.4% 1.1%

Source: PYMNTS Intelligence

Fraud And Financial Crimes In North America N = 200: Complete resoponses, fielded April 29, 2022 - June 3, 2022

⁸ Note: Data for FIs with assets between \$1 billion and \$5 billion is not included in time comparison charts.

ACTIONABLE INSIGHTS



01

Misuse of account information is still the leading source of fraud, with each FI losing \$1.5 million in the last year to this type of fraud. These losses include increases in fraud related to digital wallets, same-day ACH and regular ACH payments, which can be attributed to the increasing speed of digital transactions. This suggests that FIs need to improve user authentication protocols and increase efforts to identify unauthorized users earlier — many with the help of ML and AI technology.



02

FIs are experiencing more challenges when combating fraud, with a significantly higher share of FIs with assets totaling more than \$5 billion citing the increased speed of payments as their biggest challenge this year than last, primarily due to the growing use of digital payment methods. FIs could benefit from payment authorization processes and advanced technology solutions that outrun bad actors. identifying fraudulent transactions as they happen.



03

Given the efficiency and success of ML and AI in combating fraud, most FIs are adding or will add these technologies to combat fraud in the next year. Outsourcing fraud detection is becoming less useful for FIs, and most plan to significantly reduce outsourcing in the next year. Instead, FIs are developing fraud solutions in-house, which tend to be more resource-intensive, and thus are employed primarily by larger FIs. Even these FIs could benefit — based on in-house resources and budget from connections with technology solution providers with expertise in these advanced technologies.



04

FIs that currently use ML and AI technologies experienced 30% fewer transactions that resulted in fraud losses in the last 12 months compared to those that do not, an indication that banks of all sizes should increase investments in these advanced technologies to combat fraud and reduce losses.

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THE STATE OF FRAUD AND FINANCIAL CRIME IN THE U.S. 2023

September 2023 Report



METHODOLOGY

he State of Fraud and Financial Crime in the U.S. 2023, a PYMNTS Intelligence and Hawk collaboration, examines the state of fraud and financial crime FIs experienced in 2023 compared to 2022, including the rising costs of fraud and what actions they have taken to mitigate fraud. We collected 200 responses from executives working at FIs with assets of at least \$1 billion from March 29 to June 16. Respondents were also part of our 2022 survey on fraud FIs experienced. In 2022, all sampled FIs had assets totaling more than \$5 billion. In 2023, sampled FIs included 108 FIs with assets totaling more than \$5 billion and 92 FIs with assets between \$1 billion and \$5 billion. Respondents were executives with deep knowledge and leadership responsibilities in the following areas: fraud and risk operations, fraud strategy or fraud analysis.

ABOUT

PYMNTS INTELLIGENCE PYMNTS Intelligence is a leading global data and analytics platform that uses proprietary data and methods to provide actionable insights on what's now and what's next in payments, commerce and the digital economy. Its team of data scientists include leading economists, econometricians, survey experts, financial analysts and marketing scientists with deep experience in the application of data to the issues that define the future of the digital transformation of the global economy. This multi-lingual team has conducted original data collection and analysis in more than three dozen global markets for some of the world's leading publicly traded and privately held firms.

HAWK

Hawk is the leading provider of AI-supported anti-money laundering and fraud detection technology. Banks and payment providers globally are using Hawk's powerful combination of traditional rules and explainable AI to improve the effectiveness of their AML compliance and fraud prevention by identifying more crime, while maximizing efficiency by reducing false positives. Hawk's modular solution can either enhance or replace rules-based systems with AI-powered transaction monitoring, payment screening, pKYC and fraud prevention in real-time to deliver greater accuracy and reduced noise.

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