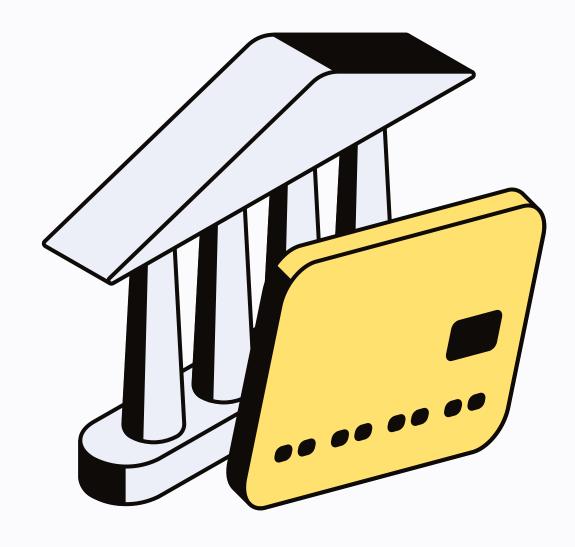


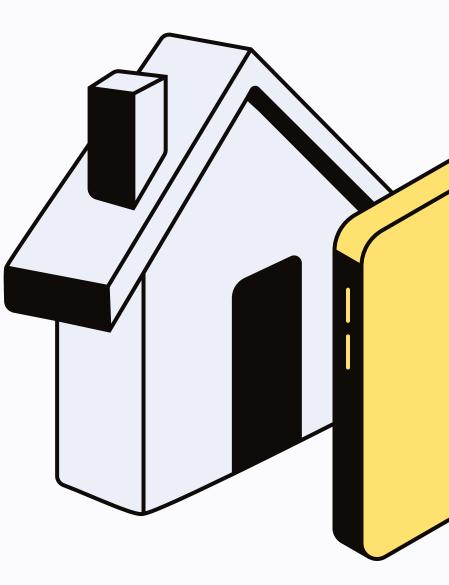
The State of Alternative Data in Lending 2024 Survey Report

A complete picture of market adoption, opportunities, challenges, and other trends in alternative credit data.

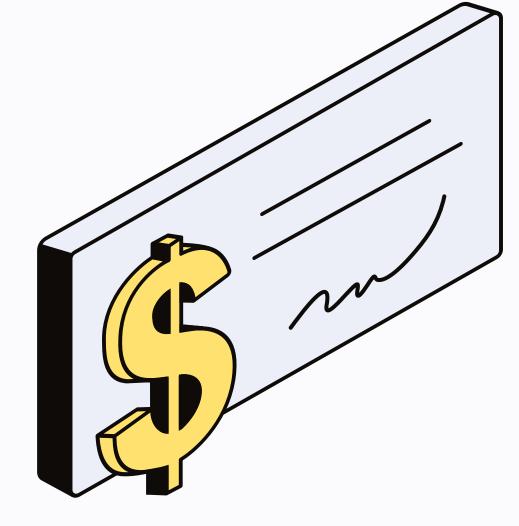
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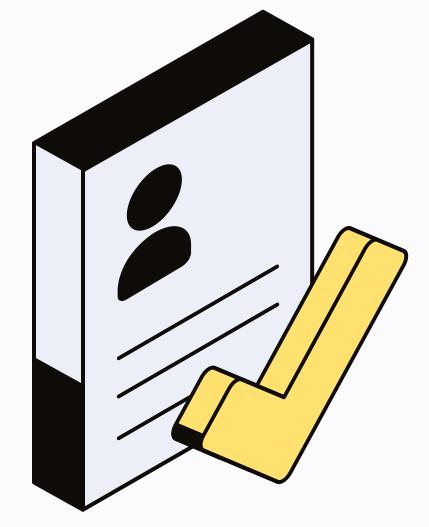
Bank Transaction



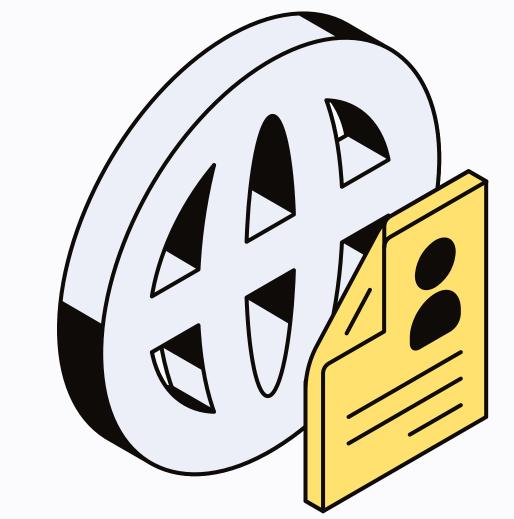
Rent & Utility



Payroll Systems



Employment



Global Bureau Data

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> As open banking in the US moves from trend to established practice, this report offers a comparative analysis of lenders' perspective on the adoption of alternative data sources in decisioning workflows plus key insights for a rapidly evolving industry.

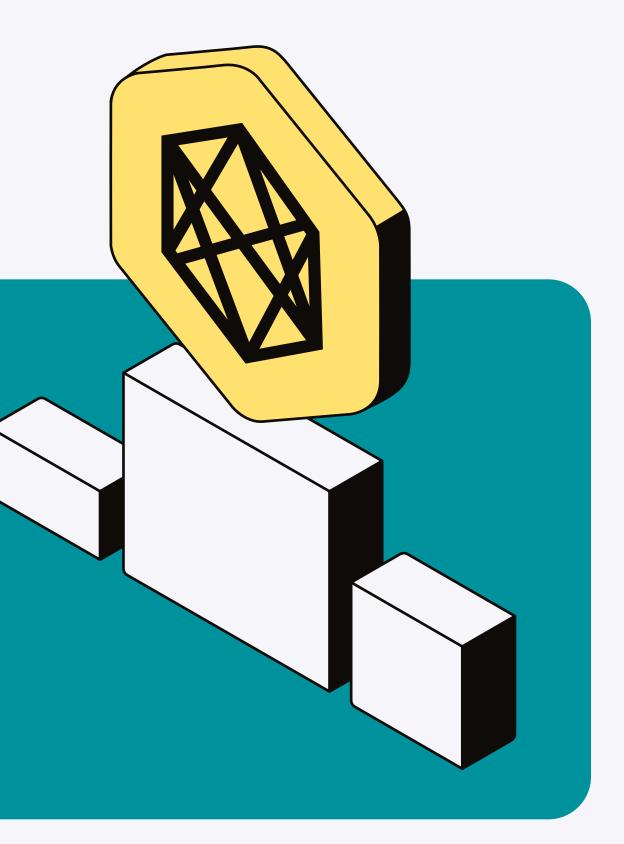


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For two years running, lenders have spoken: corporating alternative data into underwriting models ontinues to be an attractive proposition.

our 2024 survey, **43%** of respondents confirmed that ey are already using alternative data to improve their nderwriting models, and 90% agree it would help them prove more worthy borrowers.

the same time, alternative data has yet to be veraged by lenders to its full potential, despite the fact at lenders surveyed are prioritizing strategic initiatives at would greatly benefit from alternative data access.

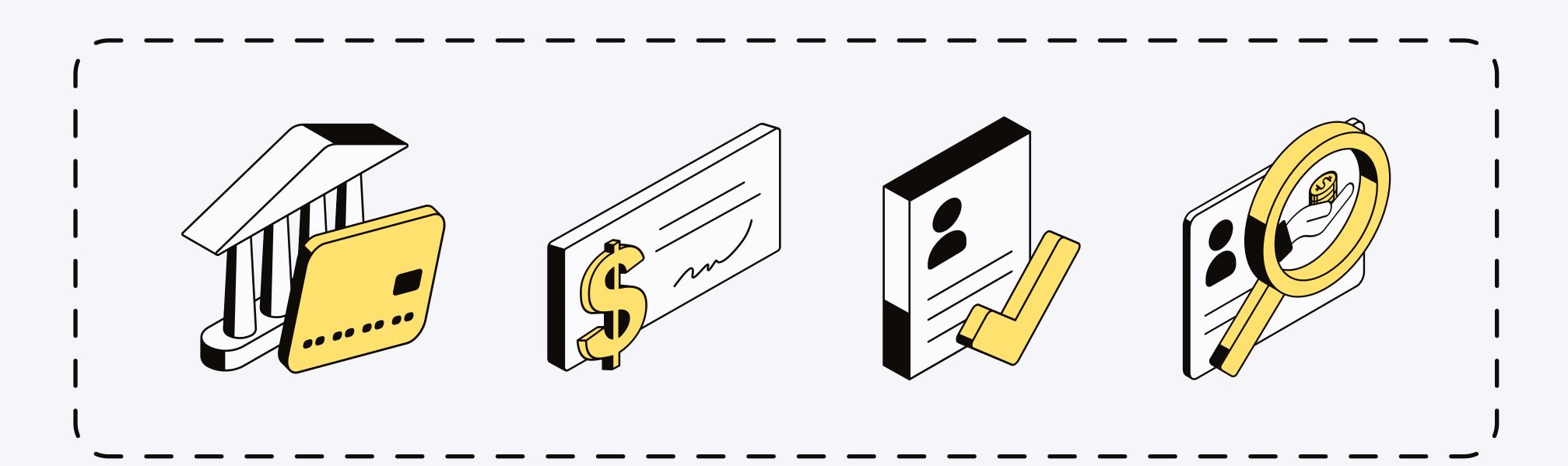


Introduction

When Nova Credit issued the first State of Alternative Data report in 2022, the consumer finance market was still reeling from the impact of COVID-19, the surge in alternative payment options like buy now, pay later (BNPL), and the threat of a looming recession.

Arguably, immediate fears of a recession have cooled, but the lending industry remains on edge. Today's lenders face rising delinquencies, elevated interest rates, and historically low demand—not to mention macroeconomic challenges posed by intensifying international conflicts and climate change—making their efforts to support their bottom line through market expansion and risk reduction even more pressing.

Meanwhile, many lenders are turning to alternative data sources, like bank data, income and employment records, and bill payment history, to supplement traditional credit reports in their underwriting processes. Combined, these sources offer a more comprehensive view of financial health, especially for thin file consumers (like younger generations and recent immigrants) who have had limited opportunities to build a formal credit history.





To learn more about the ways alternative data is shaping current underwriting practices—and the potential it holds for the future— Nova Credit surveyed 125 decision-makers at banks, credit unions, fintechs, and other lending institutions.

This report examines what they had to say about the benefits and challenges of using alternative data, key barriers to adoption, the role third-party data providers can play, and how proposed regulatory shifts are poised to transform data-sharing models for lenders and borrowers alike.

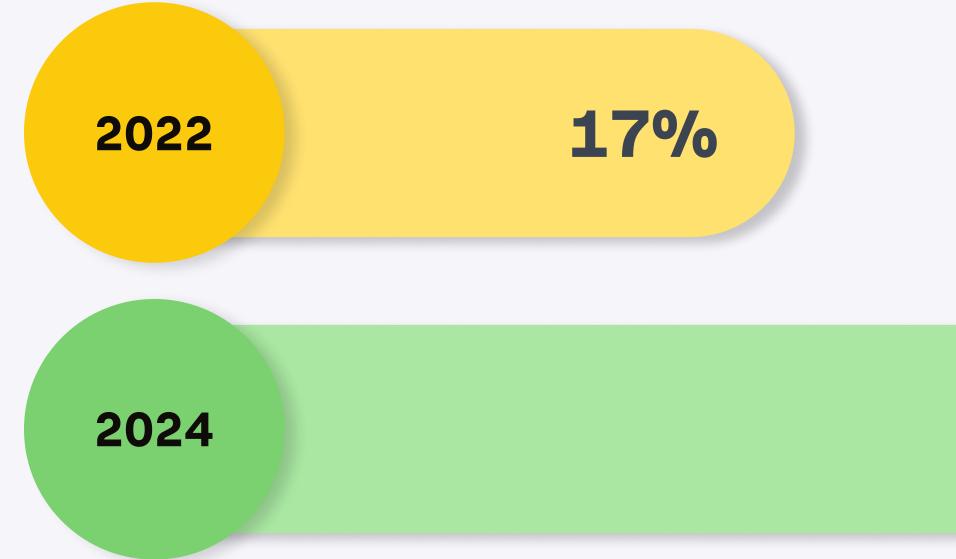
The effective use of alternative data in contemporary underwriting practices still presents challenges for lenders, impacting the extent of its adoption. We found that, while 90% of the lenders we surveyed feel that access to more alternative data would help them approve more worthy borrowers, only **43%** currently supplement credit scores with alternative data in their risk assessments.

Where Lenders Get Their Data

Most lenders still rely on traditional, cr practices as their main form of risk as held belief that credit scores have con

Our survey found that a substantial nu scores do not accurately represent cro financial landscape. This number is up significantly fewer surveyed lenders e completeness of credit scores.

Percentage of lenders who report that accurately represent creditworthines



Inarguably, credit scores tell just one p That's because credit scores are only that's reported to credit bureaus, which a consumer handles their outstanding Credit scores don't take into account a comprises a consumer's financial life.



credit data-based underwriting	Cre
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redit scores are also partly calculated on lagging data, as some vents—adverse or otherwise—don't show up in a credit report for O days or more. That makes credit scores themselves a snapshot of consumer's past rather than a trustworthy representation of their resent. And credit reports themselves are <u>prone to errors</u> that can indermine their usefulness.

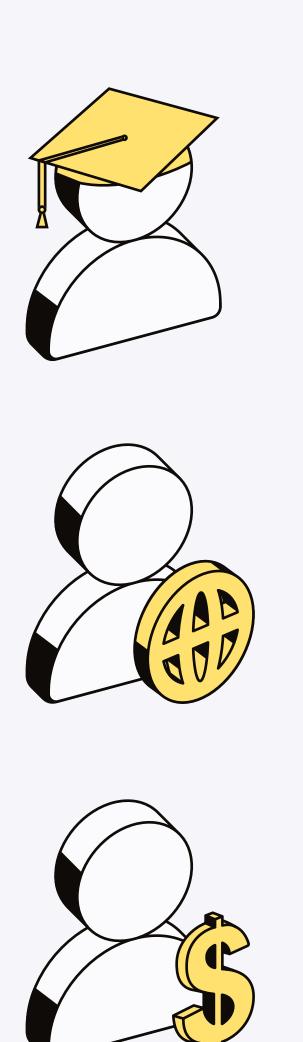
as a result, credit scores can ask critical information about onsumers' creditworthiness. fact, it's not uncommon to d that consumers with verage and even above verage credit are actually in a recarious financial situation.



<u>2023 survey from PYMNTS and LendingClub</u> found that **49%** of onsumers living paycheck to paycheck who have no issues paying heir monthly bills and **22%** of paycheck-to-paycheck consumers who o have issues paying their bills report having super-prime credit cores. In other words, there are a significant number of super-prime onsumers who may be one hardship away from defaulting on a loan.

On the flip side, consumers with low or credit risks. That's because around 62 almost a quarter of the adult population

Thin file consumers are likely to includ



Young people, who hav nor reason to open final for credit, and take on o

Recent immigrants, wh established credit histo that are not reflected in

Low-income workers, obstacles applying for

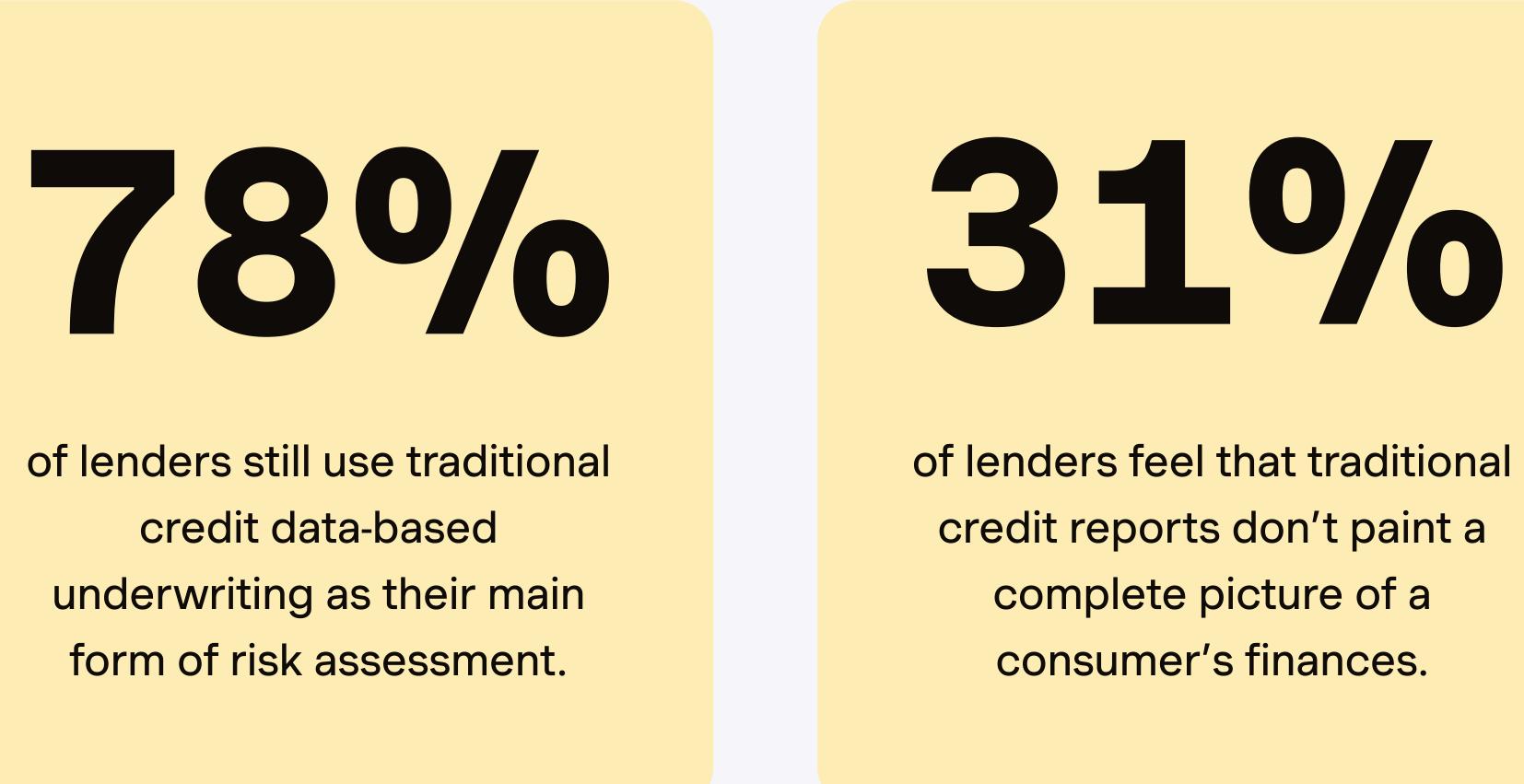
In practice, this means that, even if a t employed, earns a steady income, and unreported bills like utilities and rent, credit data will deem their creditworthiness too difficult to evaluate.

¹ The term thin file is used to describe consumers who have fewer than five accounts listed in their credit report.



r no credit scores can be good <u>million U.S. consumers</u> today (or on) are considered to be thin files. ¹	Th op po
de:	
ve not had much time ancial accounts, apply debt.	
ho may have well- ories in other countries n their U.S. reports.	
who face greater and obtaining credit.	To to
thin file applicant is securely d consistently pays traditionally a lender relying primarily on	Th pe ler

ne result is a lose-lose situation: The lender misses out on promising portunities to grow their portfolio, while the applicant is denied stentially life-changing access to financial services.



address this financial knowledge gap, many lenders are turning alternative data sources to bolster their underwriting models.

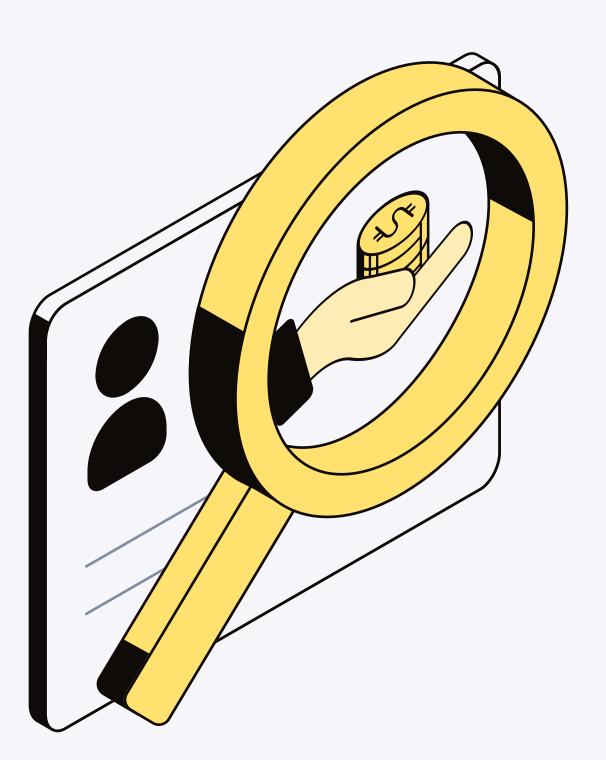
nis alternative data is often direct-source and consumerermissioned, meaning consumers give their informed consent for nders to access it straight from the system of record—like their bank account, employment platform, or payroll provider.



We found that **43%** of lenders are currently using alternative data to gain a deeper understanding of consumer finances—including more than half (52%) of surveyed fintechs.

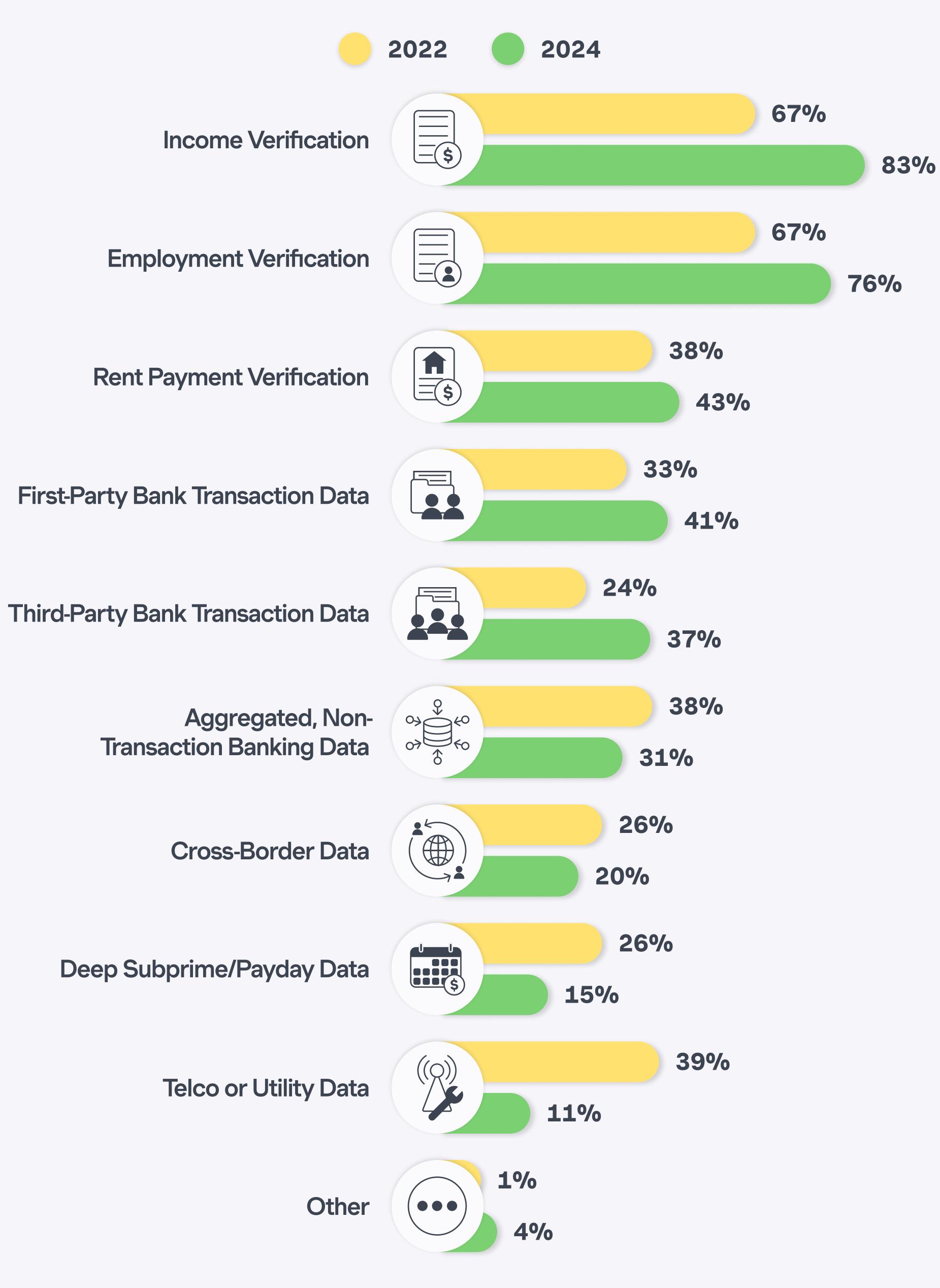
This alternative data largely comes from income verifications (83%), employment verifications (76%), rent payments (43%), and bank transactions through first-party (41%) and third-party (37%) sources.

They're data points that don't lag like credit reports. Instead, they indicate how consumers are actively managing their cash flow in real time. If a consumer regularly honors their day-to-day financial obligations and has enough earnings and financial resources to take on additional debt, alternative data can show that. In turn, it offers a more complete view of a consumer's creditworthiness.





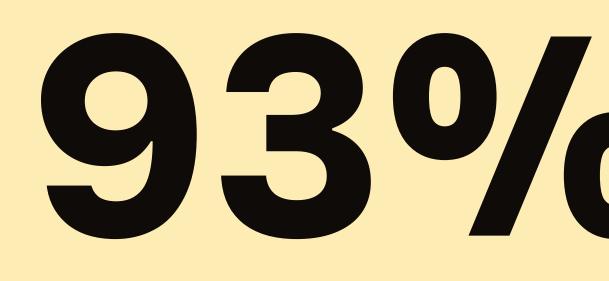
What forms of nontraditional/alternative credit data do you use?



The Benefits of Alternative Data

Surveyed lenders generally agreed that the more data they can leverage in their decision-making, the better. Among those currently using alternative data, the most commonly cited motivation was gaining a more holistic view of applicants' financial health in order to make more confident and profitable lending decisions, particularly when evaluating nontraditional consumers.

"Using alternative data has resulted in higher approval rates, higher initial credit lines, and increased utilization timelines." - Anonymous Survey respondent



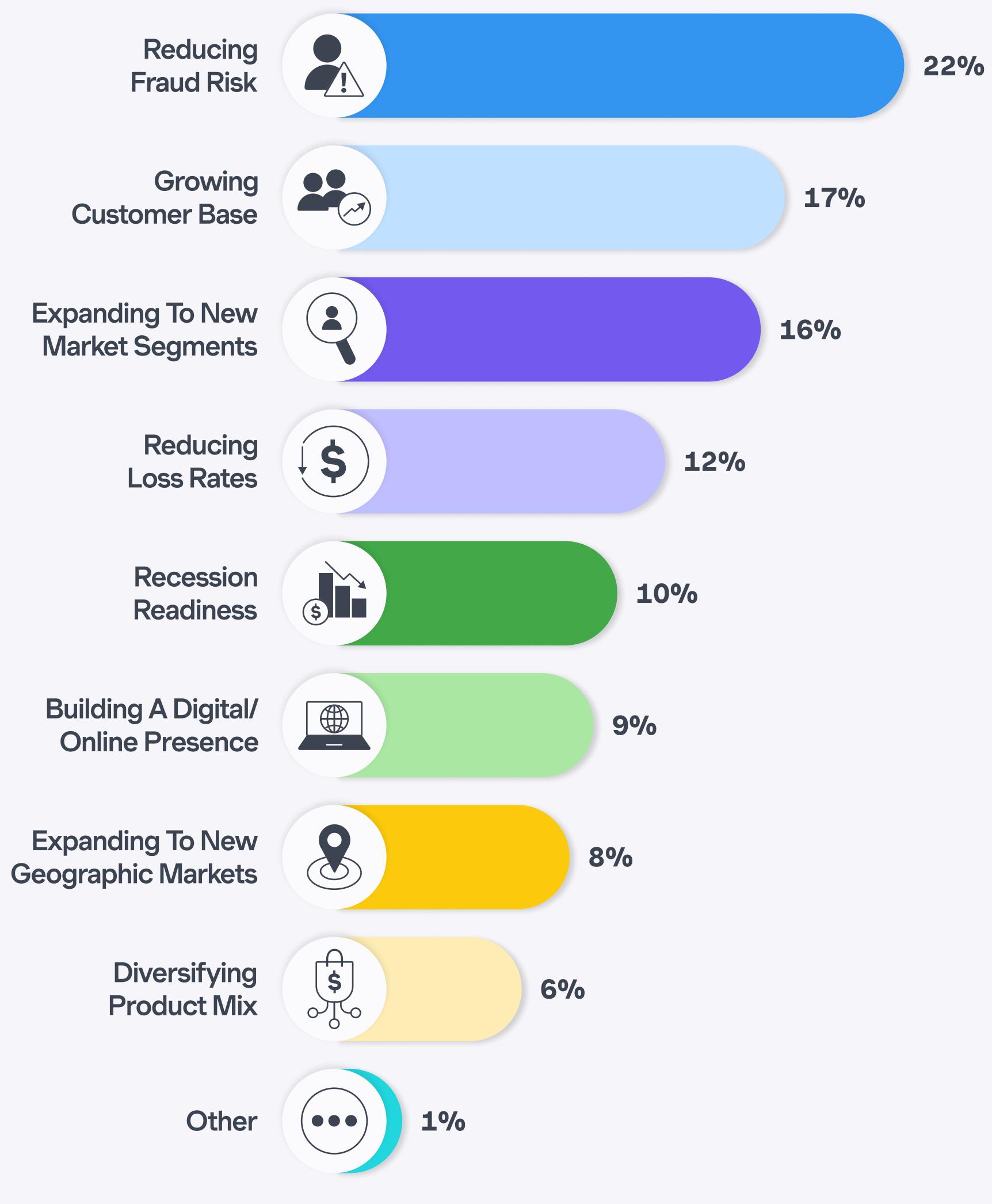
Nearly all lenders who have adopted alternative underwriting data feel it has had a positive impact on intended KPIs.

Lenders who use alternative data note stronger portfolio performance across the board, including higher approval rates and initial credit lines, increased borrower engagement and retention, more accurate risk assessments, reduced losses, faster application and funding timelines, and expanded market share.

The benefits of using alternative data should be a clarion call for lenders, many of whom are focused on shoring up their bottom line in light of an uncertain economy. Protecting their profits by reducing fraud (22%) and loss (12%) as well as growing their business among their current customer base (17%) and across new market segments (16%) are among their highest priority initiatives.



Which of the following do you view as the greatest strategic initiative for your organization?

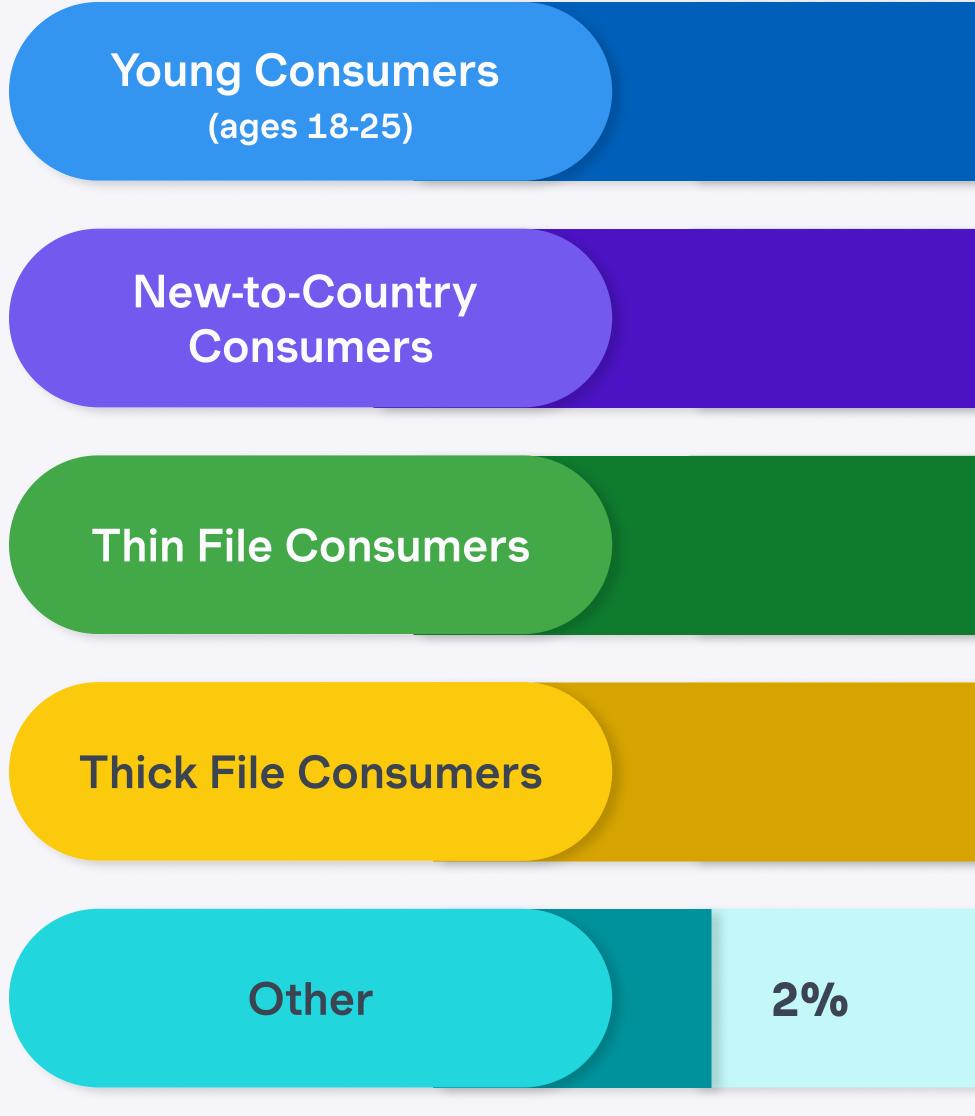




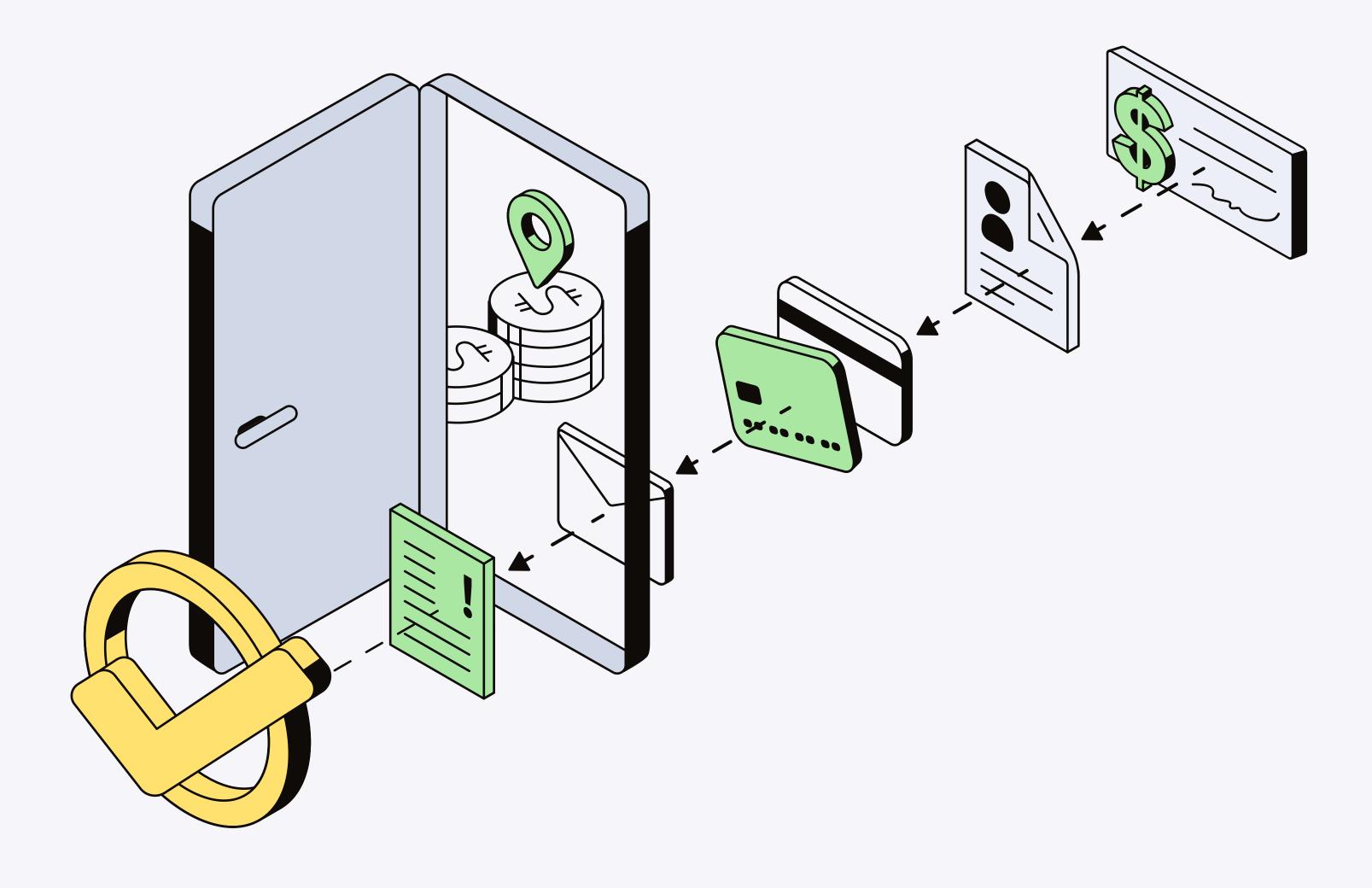
These goals surpassed initiatives that have historically been frontof-mind for financial institutions, including building a digital/online presence (9%), expanding to new geographic markets (8%), and diversifying their products and services (6%)—which were all among the top priorities for lenders in our 2022 survey.

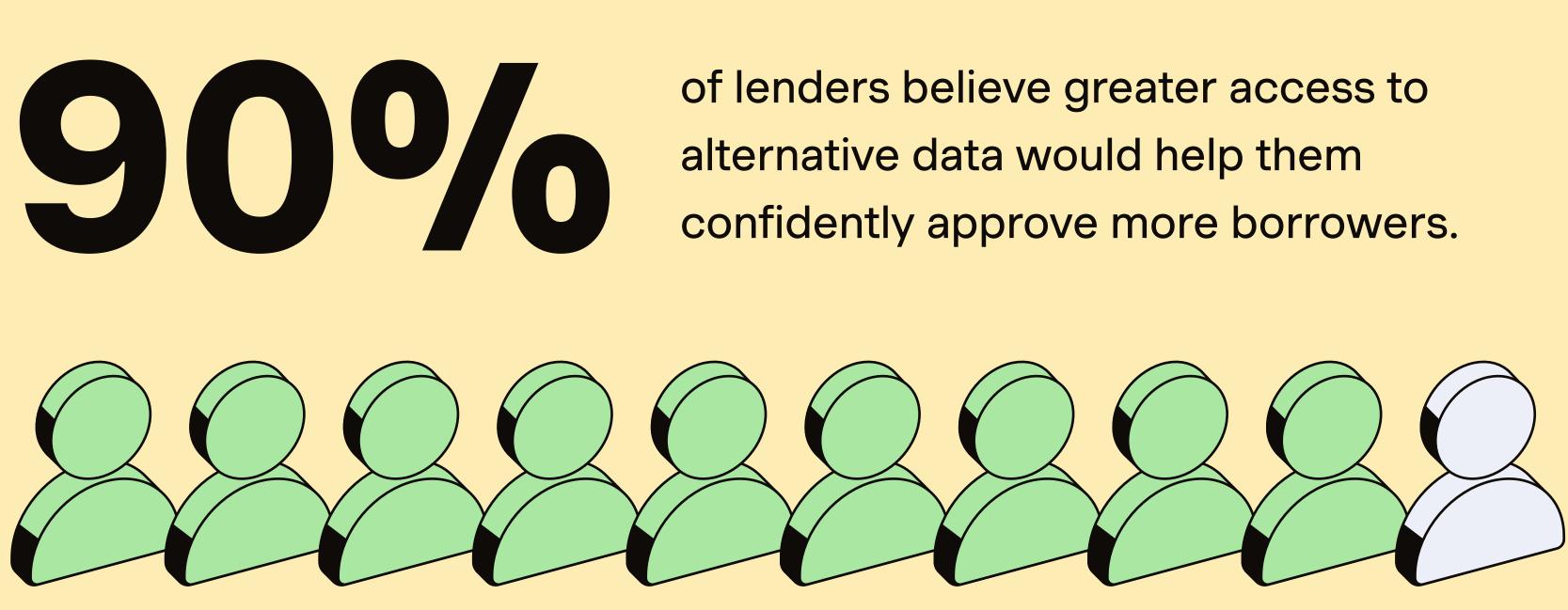
Lenders' new areas of focus are those most directly supported by the use of alternative data, which can be particularly powerful when it comes to approving a greater volume and range of borrowers without taking on additional risk.

Which customer segments do you view as having the greatest Lenders are aware of the potential alternative data holds in this regard. In fact, a vast majority of survey respondents (90%) opportunities for growth for your organization? believe that greater access to alternative data would help them tap Young Consumers into new markets of interest. So, why aren't more lenders putting 73% (ages 18-25) alternative data to use? New-to-Country 41% Consumers of lenders believe greater access to alternative data would help them 39% Thin File Consumers **Thick File Consumers** 32% Other 2%









Key Barriers to Adoption

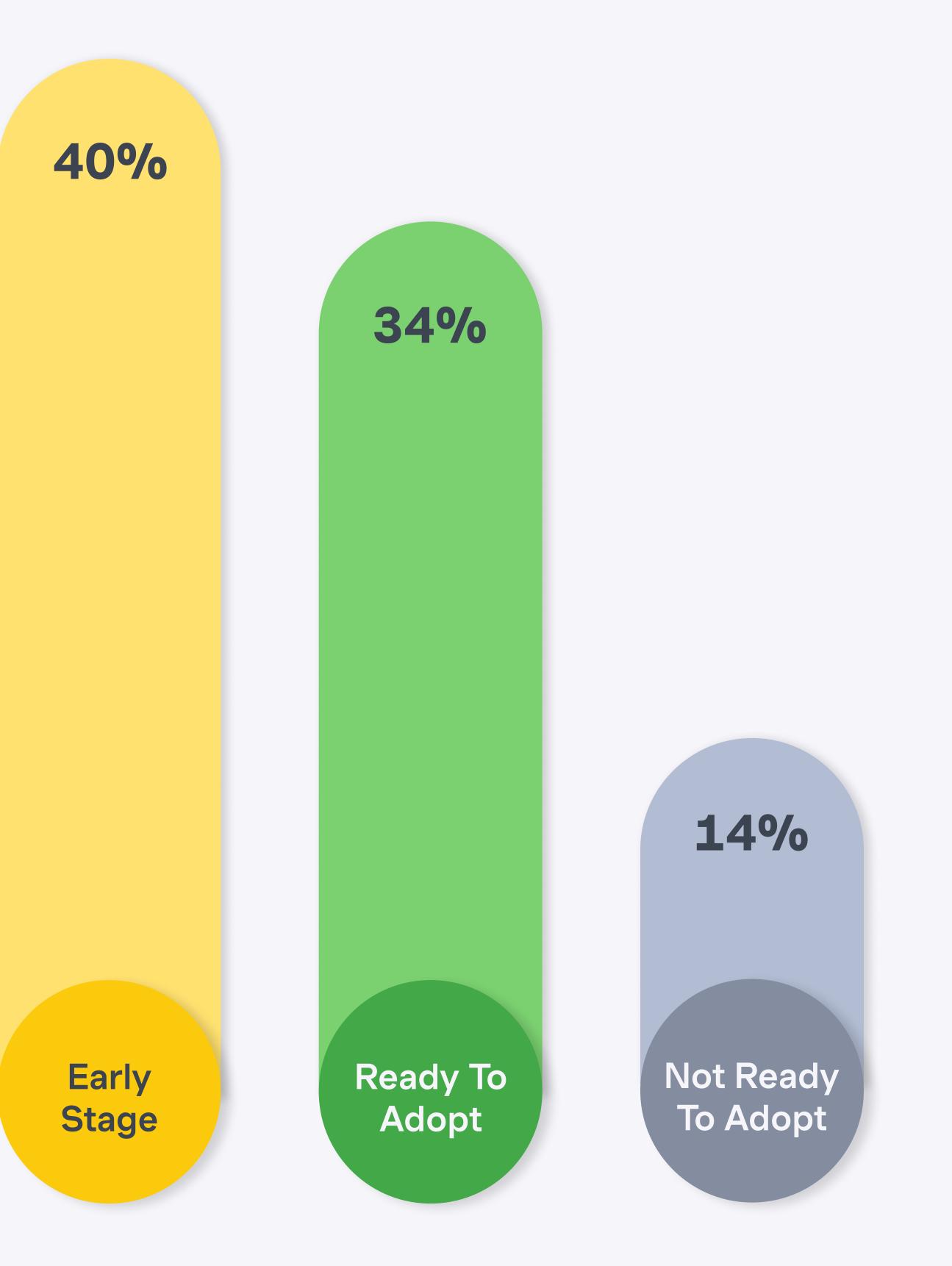
Despite high expectations and promising results, not all lenders feel that their organization is ready to leverage alternative data as part of its underwriting process.

Digital-native fintechs (83%) and banks (78%) feel the most prepared to implement consumerpermissioned alternative data sources today, while only **57%** of credit unions are confident about their current capabilities.

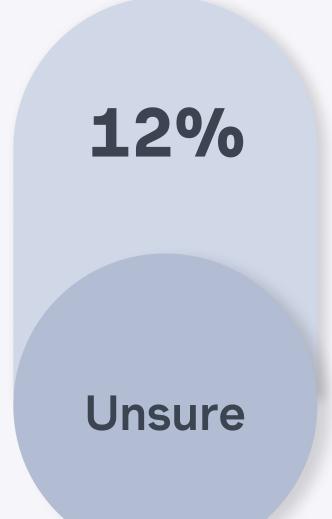
Respondents also believe that most of their fellow lending institutions are in the early stages of adopting (40%) or just becoming ready to adopt (34%) alternative data models into their credit risk assessments. And more than a quarter (26%) either feel that the industry is not yet ready to handle new data sources or are unsure about its current level of preparedness.



Which of the following best describes where the majority of the industry is with adopting alternative credit data into credit risk assessments?



What's more, a majority of surveyed lenders (82%) expressed some hesitation around using alternative data in their own underwriting.



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data in your risk assessments?

Risk Of Increased Regulatory Scrutiny/Compliance Risk

> **Reliability And/Or** Stability Of The Data

> > Cost Of **Purchasing Data**

Technical Work Required To Integrate

> **Stage Of Adoption** By The Industry

Funding Loans Approved **Using Alternative Data**

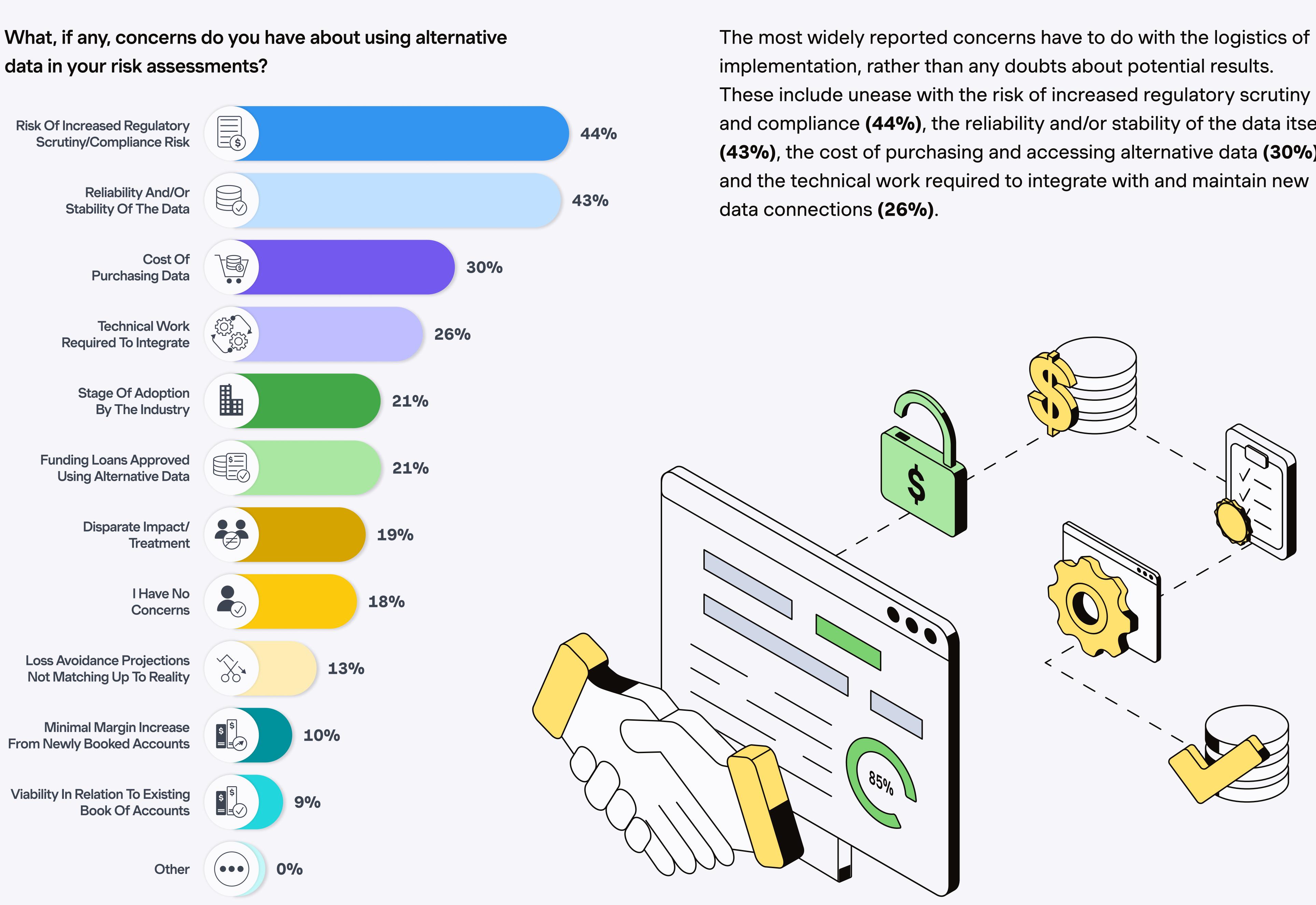
> **Disparate Impact/** Treatment

> > I Have No Concerns

Loss Avoidance Projections Not Matching Up To Reality

Minimal Margin Increase From Newly Booked Accounts

Viability In Relation To Existing **Book Of Accounts**





and compliance (44%), the reliability and/or stability of the data itself (43%), the cost of purchasing and accessing alternative data (30%),

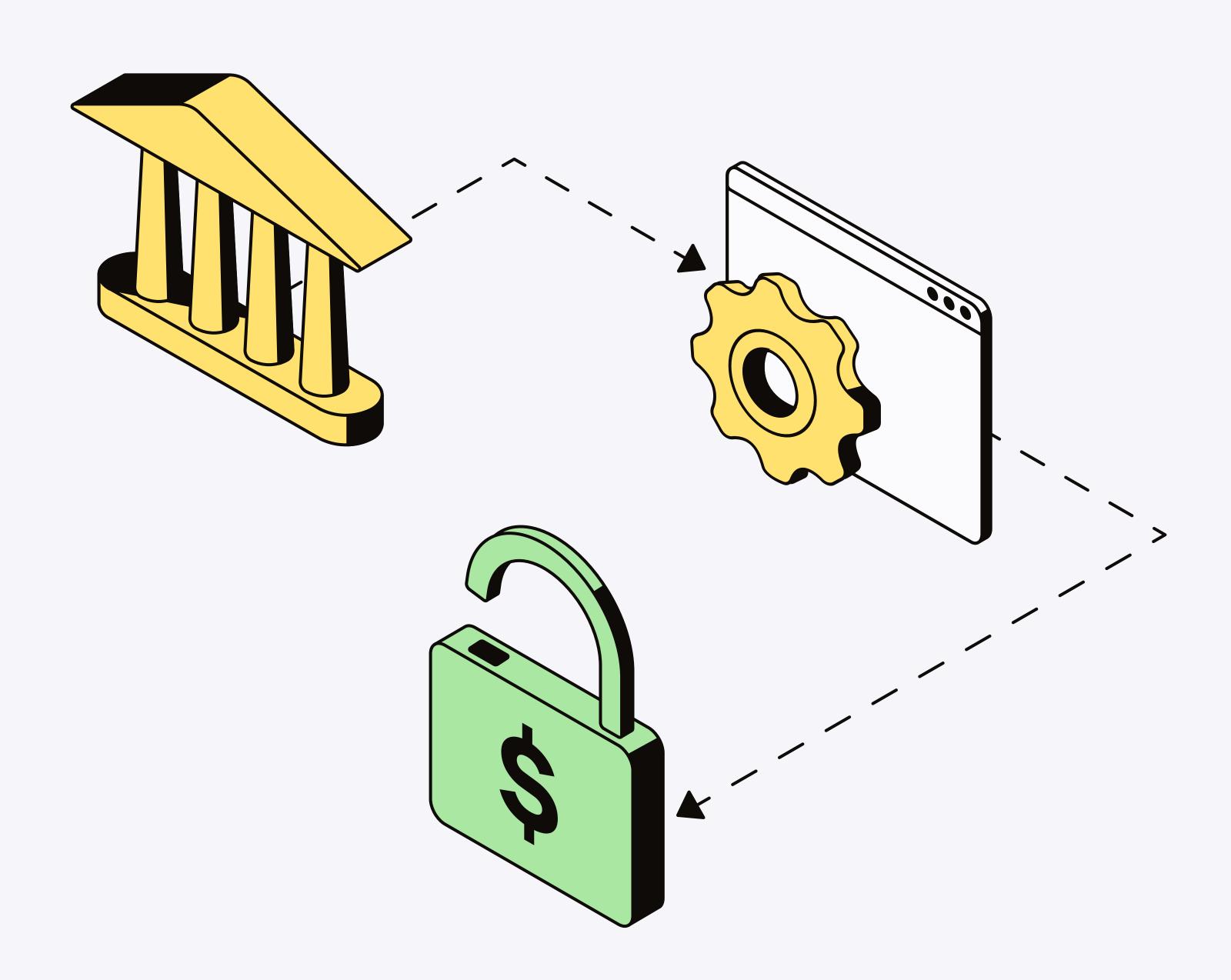
These barriers could all be solved by partnering with a specialized alternative data provider. Many specialized providers optimize for time, cost, and regulatory needs by using API technology to establish realtime connections with multiple original data sources. In turn, they help lenders get off-the-shelf infrastructure quickly to market, access preverified financial data directly from a range of sources, and avoid the time, cost, and hassle of manually collecting and orchestrating data.

That's why 71% of surveyed lenders foresee an opportunity to collaborate with third-party vendors to help them implement alternative data practices like open banking, with one finance professional going so far as to say, "We would be dumb not to use their expertise and analysis."

That said, most are still largely unfamiliar with top consumerpermissioned data providers on the market, indicating that more awareness is needed to drive the alternative data market forward.



"Third-party data providers specialize in open banking technologies, data security measures, and compliance regulations. They can help organizations like ours navigate the complexities of implementing an open banking solution."



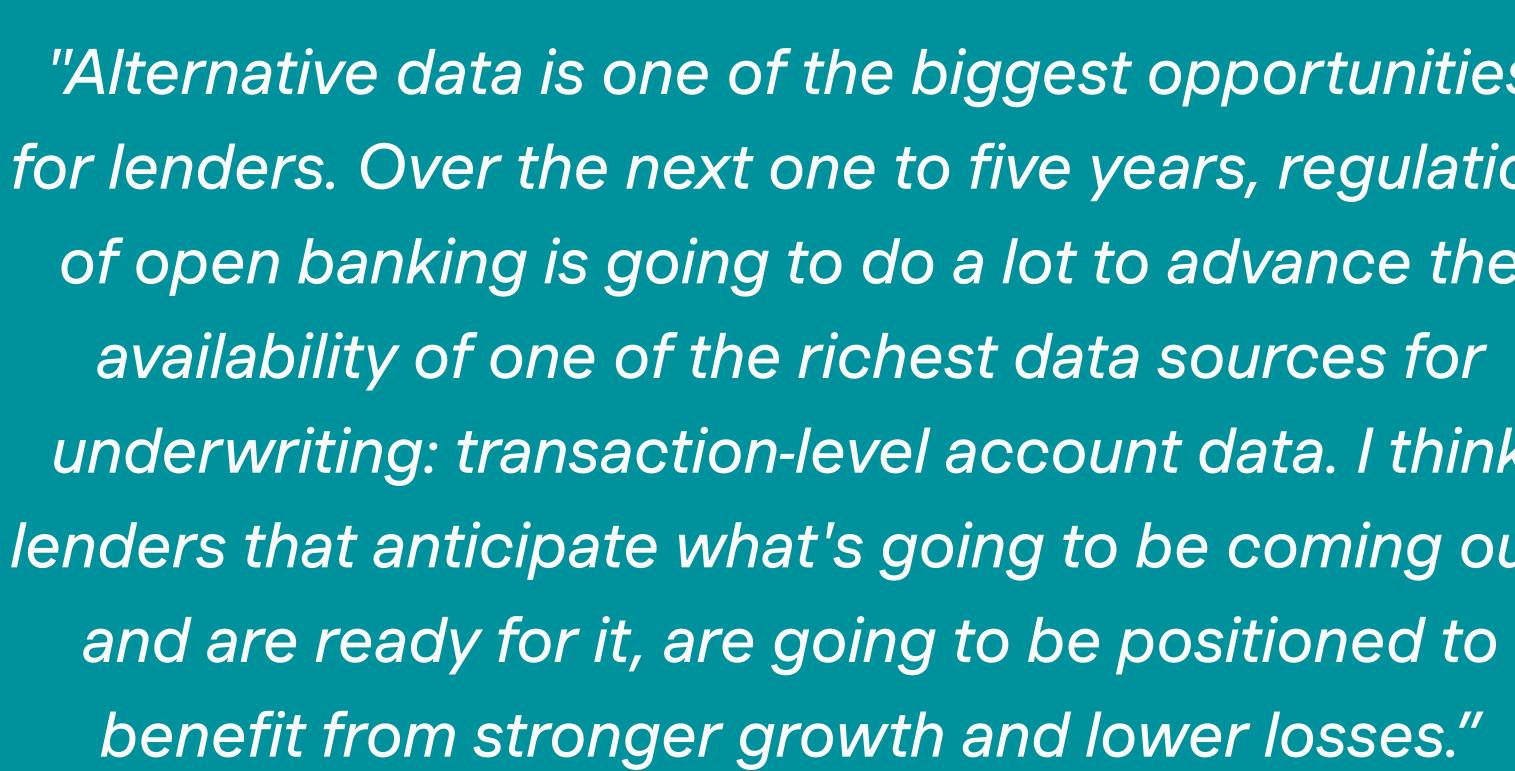
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of lenders are looking to thirdparty data providers to help them navigate the adoption of open banking practices.

Expected Shifts in the Market

There is wide consensus among finance popularity of alternative data stands to particularly when it comes to regulato surveyed lenders believe that open back have a significant influence on the devise security protocols.





Brian Hughes Former Chief Risk Officer DISCOVER



nce leaders that the rising	Spo
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Do you think CFPB's proposed rule will help reduce friction for consumers to provide lenders with permission to access their data?



pecial attention is being paid to the <u>1033 "Personal Financial Data</u> <u>ght" rule</u> proposed by the Consumer Financial Protection Bureau FPB). If approved, it would require financial institutions to provide onsumers with shareable access to their own financial data, including formation from bank accounts, credit cards, and digital wallets.

he idea is that this would not only hasten the shift to open banking, would make it easier for consumers to shop for and switch to new hancial service providers. This would ultimately drive competition and improve the accessibility and affordability of financial products and services.

ne 1033 ruling has important implications for lenders, in particular. mong survey respondents, a large majority **(75%)** expect that, if assed, it will reduce obstacles as consumers seek to share formation from a growing number of sources—streamlining the ay lenders collect and consider alternative data points in their redit risk assessments.

Yes - 75%

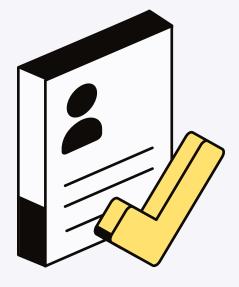
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No - 25%

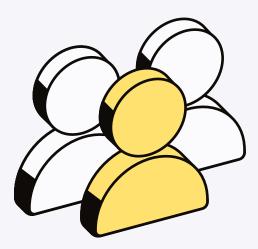
Key Takeaways



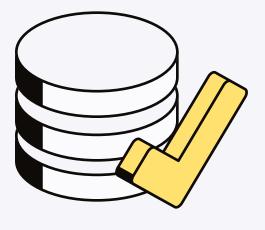
The data reveals that a significant number of the lenders we surveyed **(31%)** feel that credit scores do not accurately represent creditworthiness in today's financial landscape, and **90%** feel that access to more alternative data would help them approve more worthy borrowers. However, while more lenders are steadily supplementing credit scores with alternative data in their risk assessments **(43%)**, industry adoption is not yet universal.



As lenders look to reduce risk (22%), grow their customer base (17%), and expand their addressable market (16%) amid lingering economic uncertainty, alternative data offers a promising path forward—and a more accurate and comprehensive way of evaluating consumers' creditworthiness than traditional credit reports.

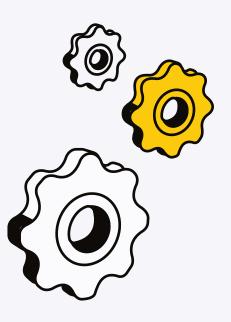


The three market segments respondents most hope to engage in 2024—young consumers **(73%)**, recent immigrants **(41%)**, and other thin file applicants **(39%)**—are among those whose true creditworthiness is best determined by the more expansive visibility offered by alternative data.



Obstacles to more widespread adoption of alternative data among lenders surveyed include unease with the risk of increased regulatory scrutiny and compliance (44%), the reliability and/or stability of the data itself (43%), the cost of purchasing and accessing alternative data (30%), and the technical work required to integrate with and maintain new data connections (26%).

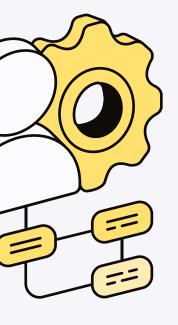




The emergence of specialized, third-party data providers is paving the way for lenders to incorporate alternative data sources into their existing underwriting processes. **71%** of surveyed lenders foresee an opportunity to collaborate with third-party vendors to help them implement alternative data practices.



Meanwhile, surveyed lenders believe proposed regulations, like the CFPB's 1033 Rule, offer great promise in terms of data accessibility **(75%)**, but also great disruption to current protocols for the security of consumer data **(81%)**. Some lenders speculated that it would increase their liabilities, creating the need for more infrastructure to remain compliant and relevant.



Together, these industry developments will transform the way lenders access and use consumer information and make alternative data the powerful, industry-shifting resource it was always intended to be.

About Nova Credit

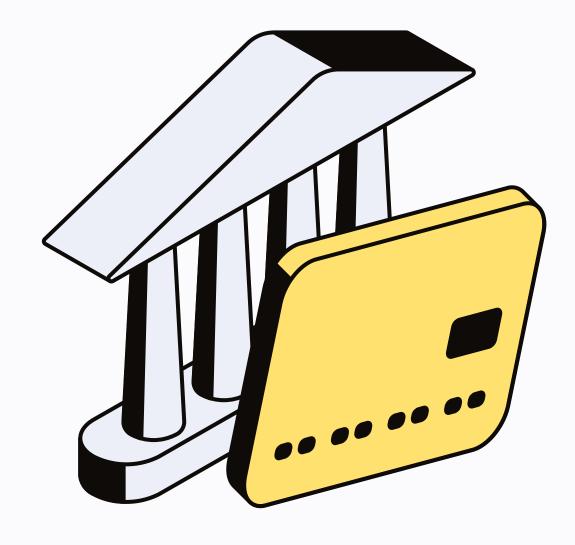
Nova Credit is a credit infrastructure and analytics company that enables businesses to grow responsibly by harnessing alternative credit data. The company leverages its unique set of consumer-permissioned data sources, bank-grade infrastructure and compliance framework, and proprietary credit expertise to help lenders fill the gaps that exist in traditional credit analytics. Nova Credit serves as the bridge between data and credit excellence, providing a comprehensive suite of solutions designed to give lenders across various industries—including finance, fintech, property management, telecom, and automotive—a competitive edge in the era of open finance.

Its cross-border credit product, Credit Passport®, cash flow underwriting product, Cash Atlas[™], and income verification product, Income Navigator, are used by leading organizations like American Express, Verizon, HSBC, SoFi, Scotiabank, and Yardi. Nova Credit is backed by investors including Canapi Ventures, Kleiner Perkins, General Catalyst, and Index Ventures as well as executives from Goldman Sachs, JP Morgan, and Citi. Learn more at <u>www.novacredit.com</u> or reach out to <u>connect@novacredit.com</u>.

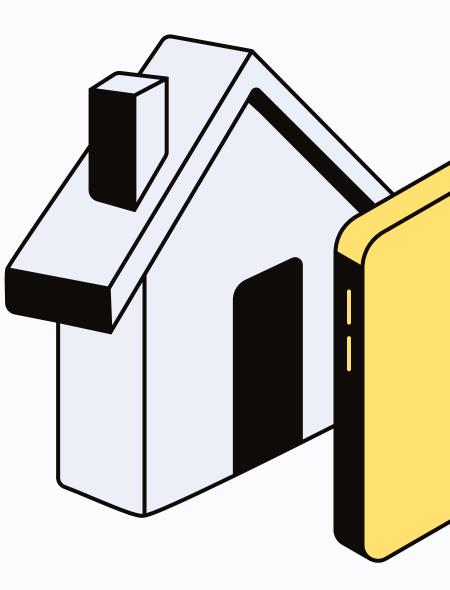
Methodology

This survey was commissioned from independent research firm, Researchscape, which ran an online survey among 125 U.S.-based finance leaders from banks, credit unions, fintechs, and other lending institutions between January 23 and February 6, 2024.

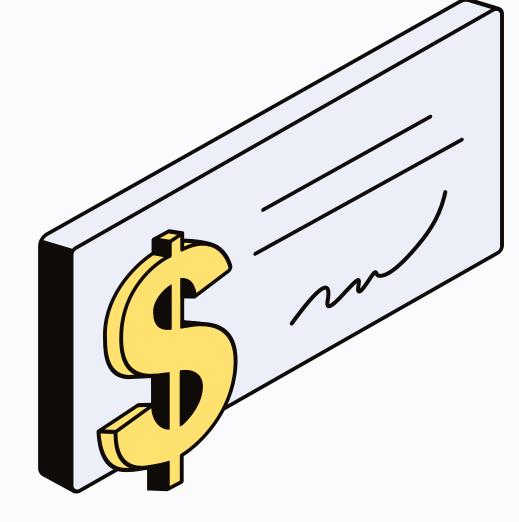




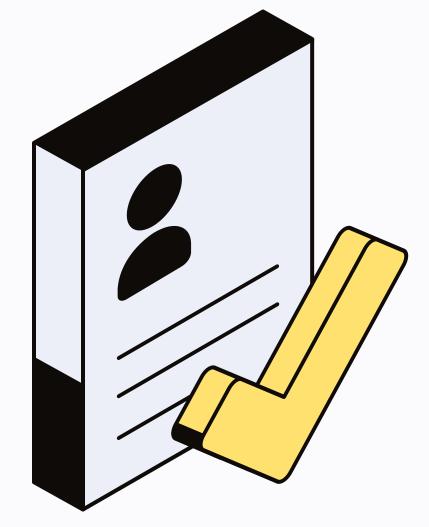
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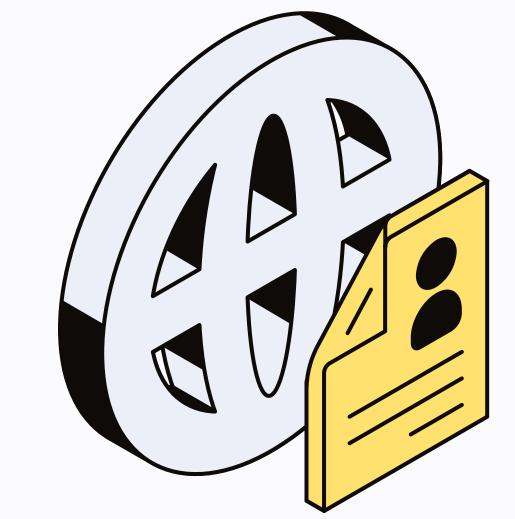
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