



Welcome!



Welcome to the Power Station



- We hope to inspire you
- Optimise your road to an excellent customer journey
- Help you navigate how to make the best decisions
- Give you insights into the Experian Machine Room





Our past is shaping our future

We never saw the global pandemic coming.

We never thought a conflict in Europe would break out.

But unforeseen aspects continue happening – both globally, locally and probably even in your own business environments – therefore we believe that by strengthening our partnership we can help you navigate these changes by:

- ✓ having the right data to gather customer insights
- ✓ trusting on reliable systems to help with risk management
 - ✓ adapting to new regulations to remain competitive











Housekeeping | Physical Attendees



Exits



Mute your phone



Ask us



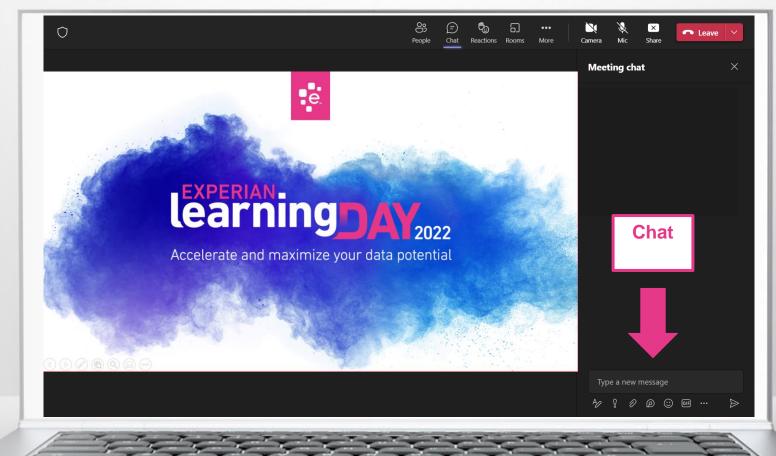


Housekeeping | Online Attendees

Use the Chat function to ask questions and if you have technical issues.

Camera & Audio

You must see and hear us – but we cannot hear you. ©











Agenda

10:00	Intro & welcome to Experian Learning Day Veronica Flyckt – Director of the Netherlands and Head of Analytics Northern Europe, Experian Netherlands			
10:10	Customer experience update: your benefits as an Experian client Jeroen Zuijdendorp - Operations Service Director, Experian Netherlands / Emma Perkins - Head of Customer Experience, Experian EMEA			
10:30	Updates on compliance and regulations Jennifer Crama - Data Protection Officer, Experian Netherlands			
10:50	Break			
11:00	The role of a credit reference agency in driving innovation and gathering customer insights Herman Peeters – Principal Consulant, Experian Netherlands			
11:35	A macro-economic analysis of the Dutch economy from a credit bureau perspective Vincent Edelkoort – Business Development Manager, Experian Netherlands			
12:00	Break			
12:10	Open Banking - Getting value from transactional data Paul Heaton - Head of Product and Propositions Marketing, Experian EMEA			
12:50	Lunch break			
13:30	Empower analytics through innovative data and tools Benidine De Kock - Analytics Consultant, Experian Netherlands			
13:45	ESG Score - the Experian approach Rodrigo Ciaran - Senior Consultant Regulatory Analytics, Experian Netherlands			
14:00	Artificial Intelligence and Machine Learning regulations Leandro Guerra - Head of Data Science and Analytics Platforms, Experian EMEA			
14:30	Round up & thank you! Veronica Flyckt – Director of the Netherlands and Head of Analytics Northern Europe, Experian Netherlands			







Customer Experience update - Your benefits as an Experian client



Jeroen Zuijdendorp
Operations Service Director
Experian Netherlands



Emma Perkins

Head of Customer Experience
Experian EMEA



Customer Experience in Experian

Three years ago, we launched our CX programme, and we have seen improvements reflected in the latest feedback



Comments about behaviour & knowledge are favourable and highlight a high level of professionalism



The introduction of digital user forums, the launch of MyExperian and the Experian Academy has given Clients improved access to information



Launching the
Experian Way of
Closing the Loop has
demonstrated we
listen to our Clients
and act on their
feedback



We are innovating with new propositions to address changing Client Challenges such as MAX







"Provide support which understands our needs, problems and products."

"Develop more new innovative products as the environment changes"



Working Together – Experian Proximity

Current Improvements

- Focus on your feedback, regular meeting for Service Review
- Faster prioritization
- Taskforces to address bottlenecks
- Direct access to Product Teams

Restructured Factory

- Change from
 Functional to Product
 oriented self sufficient
 agile teams in
 support.
- Central Delivery Hub for software projects and upgrades
- Cloud transformation!

Optimize Processes

- Move to next level of agile maturity with constant improvements
- Moving to Experian
 Cloud SaaS





"Experian offers you security"

Experian are proud to share that across the Globe our Clients **Trust** us with the highest scores

We recognize the importance of keeping your data safe and secure

The World continually faces new Fraud threats

We constantly improve technology and IT infrastructure





Bureau keeping your data safe

Upgrading the Services to enhance Client experience and to keep ahead on Security

Modernization progress

- Simplified and consolidated platforms
- Added Security in design and embedded controls
- Re-development of Services and Products





Benefits achieved

- Safeguarding data with highest Security focus
- Upgraded User interfaces and added Functionality
- Further increasing Data Quality and Data
- Service stability increase

What's next?

- New data sources
- Focus to enhance and simplify interfaces / APIs
- Further added functionality and Service simplification



"I would like to see a change in the approach to support services"





Investing in our 2nd and 3rd line support

Improving access to our experts to provide the level of support you need

Single Sign on

Service access through one interface –and with added Self Service

Enhance usability

We listen to client feedback and implement better help texts, improved process and functionality

Access review focus

Further measures to protect data – we need your help on annual client validation of user access.

Product Expert Access

Global Product Teams connected, knowledge sharing and quicker resolution







In Closing.....

Stay in touch

- Please continue to provide feedback, your insights are invaluable
- Ensure you have agreed to receive our local newsletter

https://www.experian.nl/en/events/newsletter



Sign up to MyExperian

- Our Client portal contains many resources that you will find useful
- We are continually adding new functionality and information to benefit our Clients
 https://www.experian.com/lp/decision-analytics/global/myexperian/register

Client driven improvement

- Working together, building relationships and continuous improvement
- We continually look to improve your experience with a CX programme led by our Clients' voice
- We have an award winning Close the Loop process to ensure we listen, respond and take action







Update on Al compliance and GDPR regulations









What is Artificial Intelligence?

Artificial Intelligence defined through the years
Artificial Intelligence as defined by the AI Regulation

The principles of Trustworthy Al

How does Al learn?
The 7 Principles of Ethical Al

Where AI and GDPR meet and clash

GDPR principles and the principles of Trustworthy Al Data Minimization vs. Training

Final thoughts









What is Artificial Intelligence?



Defining Artificial Intelligence

How has the definition of AI evolved?

Traditional:

The ability of a digital <u>computer</u> or computer-controlled <u>robot</u> to perform tasks commonly associated with intelligent beings.

Al Regulation:

'artificial intelligence system' (Al system) means software that is developed with one or more of the techniques and approaches listed in Annex I and can, for a given set of human-defined objectives, generate outputs such as content, predictions, recommendations, or decisions influencing the environments they interact with.





Defining Artificial Intelligence

How has the definition of AI evolved?

Traditional

(a) Machine learning approaches, including supervised, unsupervised and reinforcement learning, using a wide variety of methods including deep learning; (b) Logic- and knowledge-based approaches, including knowledge representation, inductive (logic) programming, knowledge bases, inference and deductive engines, (symbolic) reasoning and expert systems; (c) Statistical approaches, Bayesian estimation, search and optimization methods.







The Principles of Trustworthy Al







- The Danger of AI is not that it's too smart but it's not smart enough.
- Al has the approximate brainpower of a worm.
- Al does not really understand the problem you want it to solve.
- But: Al will do exactly what you tell it to. Or at least it will try its best.
- And AI will take the path of least resistance."



Janelle Shane – "You Look Like a Thing and I Love you"



How does Al learn?

What is required to get a good functioning AI solution?

Determine problem/task

- Artificial Neural Network
- Cells/Neurons
- Simple math
- What are you trying to solve?
- Simplicity is key
- Narrow

Select input

- Representative data
- Relevant data
- Fair
- Lawful
- Transparent

Continuous testing & monitoring

- Robust
- Human oversight
- Retro testing
- Document results



















The Principles of Trustworthy Al

According to the Al Working Group of the EU Commission



Technical robustness & safety



Accountability



Transparency



Privacy & data governance



Diversity, non-discrimination & fairness



Human Agency & Oversight



Societal and environmental wellbeing











Where AI & GDPR meet and clash



Where GDPR & AI meet and clash

GDPR and Al principles



Adequate safeguards vs. Robustness

- 1. Resilience to attack
- 2. Accuracy
- 3. Fallback plan
- Reliability & Reproducibility



Transparency (GDPR & Al) & human oversight

- 1. Traceability
- 2. Explainability
- 3. Communication
- Meaningful human review
- 5. Fundamental rights
- 6. Human agency



Accountability and privacy & data governance

- 1. Auditability
- 2. Minimization
- 3. Quality & integrity of data
- 4. Access to data
- 5. Privacy & data protection



Fairness vs. Fair & lawful processing

- 1. Avoidance of unfair bias
- Accessibility & universal design
- 3. Stakeholder participation









Data minimization principle

- Absolutely necessary
- Less is more
- Hungry Hungry Caterpillar
- Discussion EU level
- Data relevancy
- Connection to processing purpose











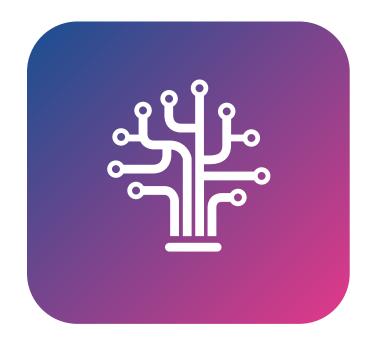
Final thoughts



Final Thoughts

Key takeaways from this session





Al is no longer something from the distant future



Regulation & practice may lead to tension



Strong data protection governance = reliable & compliant Al







ENJOY YOUR BREAK

We will resume at 11:00





The role of a credit reference agency in driving innovation and gathering customer insights



Our Experian Credit Bureaus

Country	Bureau Operations			
	Consumer	Business	Vehicle	
UK	$\sqrt{}$	$\sqrt{}$	$\sqrt{}$	
US	$\sqrt{}$	$\sqrt{}$	$\sqrt{}$	
Australia	$\sqrt{}$			
Austria	$\sqrt{}$			
Botswana	$\sqrt{}$			
Brazil	$\sqrt{}$	$\sqrt{}$		
Chile	$\sqrt{}$	$\sqrt{}$		
China		$\sqrt{}$		
Colombia	$\sqrt{}$	$\sqrt{}$		
Denmark	$\sqrt{}$	$\sqrt{}$		
Germany	$\sqrt{}$		$\sqrt{}$	
India	$\sqrt{}$	$\sqrt{}$		
Ireland		$\sqrt{}$		
Italy	$\sqrt{}$			
Lesotho	$\sqrt{}$			
Malaysia	$\sqrt{}$	$\sqrt{}$		
Mozambique	$\sqrt{}$			
Namibia	$\sqrt{}$			
Netherlands	$\sqrt{}$			
Norway	$\sqrt{}$	$\sqrt{}$		
Peru				
Singapore		$\sqrt{}$		
South Africa	$\sqrt{}$	$\sqrt{}$		
Spain		$\sqrt{}$		
Uganda	V			

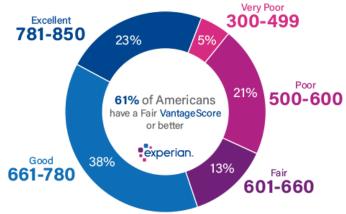


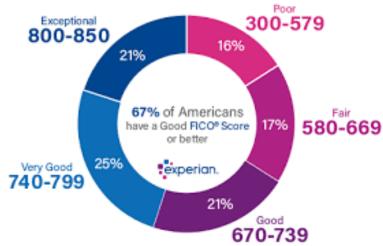


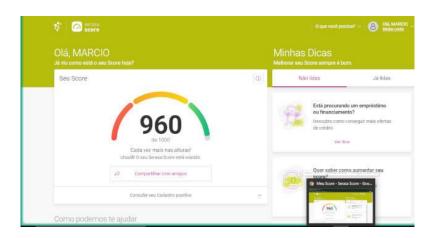




Credit Scores



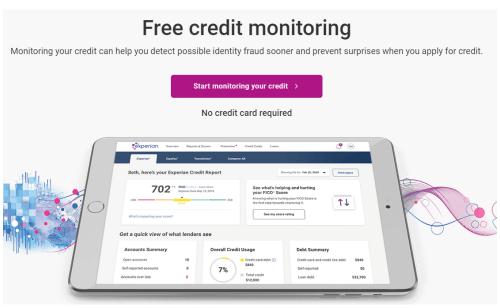


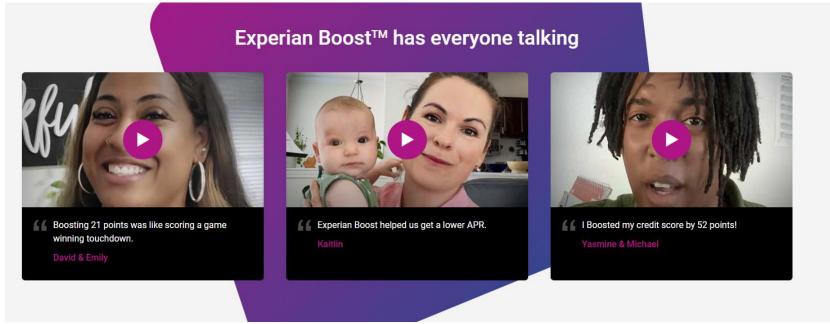






Other Consumer Attitude



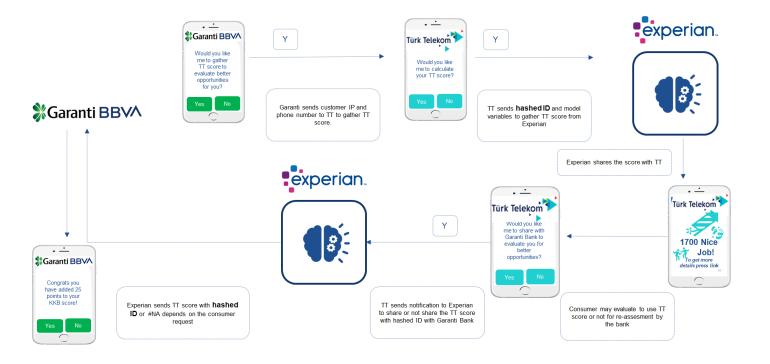






Score Boost



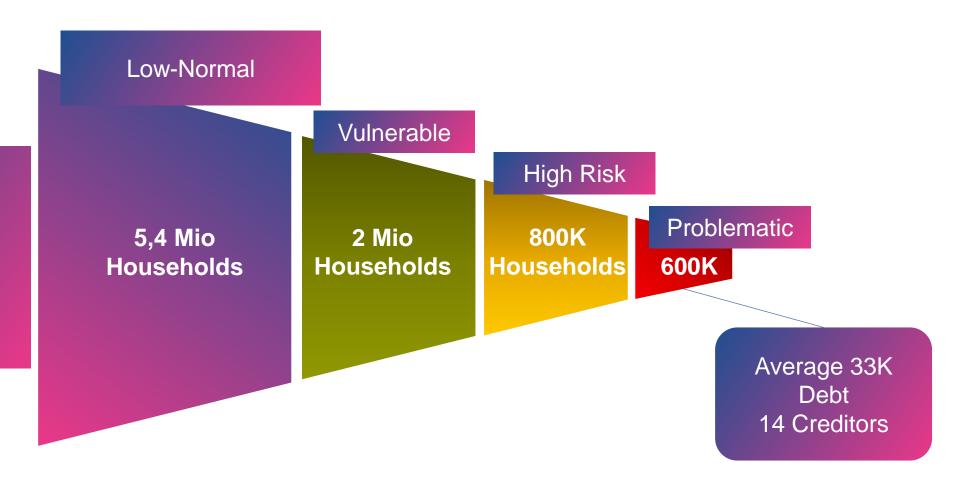






NL Context

✓ 8,7 Mio
Households
Avg. 2,14 person
per Household
✓ 3,1 Mio
Avg. 1 person
Household

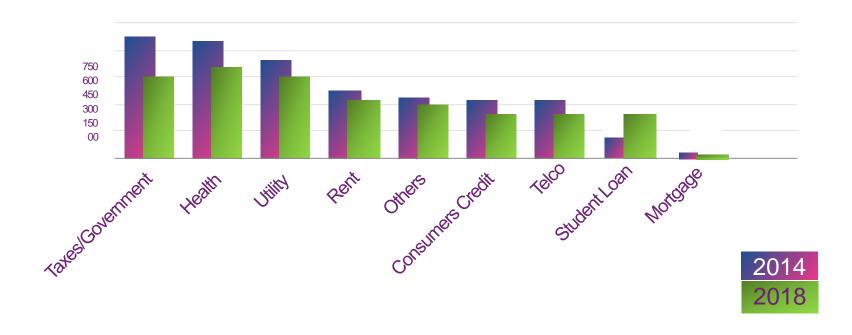






NL Context

Payment problems per product







NL Context

HELPING IDENTIFY AND PRE-EMPT FINANCIAL

Using smart insights and intelligent decisions to protect people

Stichting

VULNERABILITY

Comparative examples:

better public-private partnerships & shared



Quality & competiveness

among credit registry agencies in NL?

> Educate consumers in an increasing complex world - is debt bad or could it also provide opportunities (stigma nibud)

Grip bij geldzorgen door coronacrisis

STAPPENPLAN





TACKLING DUTCH

HOUSEHOLD

DEBT

SCHULDENLAB

Consultation

Better use of data to signal problem debt earlier



Ministerie van Economische Zaken en Klimaat

Use of Artificial **Intelligence** to predict and mitigate financial risks for councils & lenders





Decentralised approach in NL (responsibility with councils) is a problem: not all councils are adequatly equipped to signal and deal with bad debt



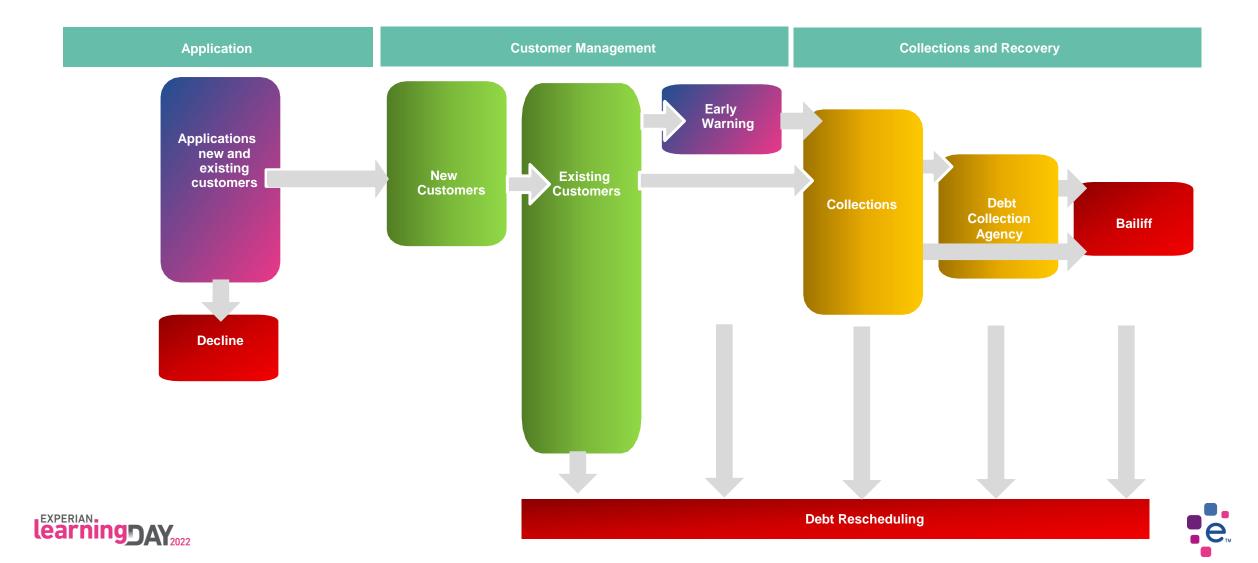








Value



Value



Value of a Credit Bureau



Responsible access to credit and payment solutions

Protection Over indebtedness

Better and honest conditions



Access to trustworthy data

Companies without access to BKR still can make a proper risk assesment

More information about financial well being of consumers

Lower cost of risks and losses



Responsible financial inclusion for regulated credit- and payment options

Less (credit) losses to be balanced via margin/pricing

Less households affected by increasing payment problems

For Consumers

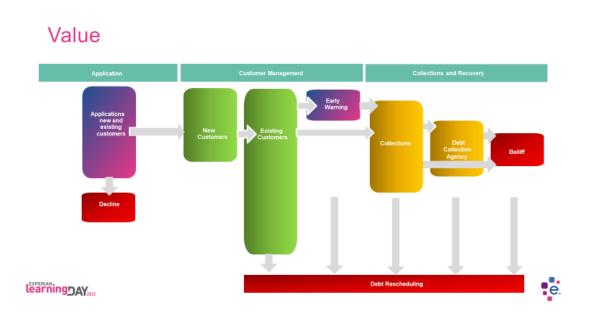
For Companies

For Society





Value for you – We need you













A macro-economic analysis of the Dutch economy from a credit bureau perspective



Experian's mission is to drive financial inclusion and help facilitate access to fair and affordable credit.



Giving credit where credit is due is a very rewarding habit to form."

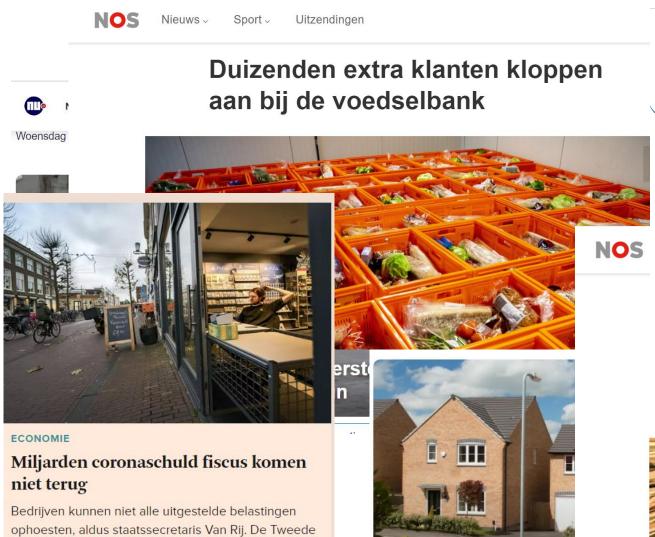
Loretta Young (actress)





Themes in the Dutch economy - news

Drie op de honderd meer dan 1 miljoen



Kamer bepleit mildheid.



Thema's Agenda Over VCMB Nieuws Blog Waa

24,4 miljard euro: totale studieschuld loopt op door

corona

By Ingrid Kok | 24 november 2021 | 0

Dit artikel delen:





Themes in the Dutch economy - trends





What do we see back in our sector



Net result



Uncertainty is driving overall volume is steadily increasing



Quick return to pre covid levels in many sectors, with a staring decline in q1 2022



Inflation pushes overall scores up, but expectation is that there will also be an influx of negative registrations coming in





Credit score going up as a whole

The volume on score is building up as the sectors are preparing for the post covid bankruptcy wave.

The inflation is pushing up general scores as inequality is also increasing.



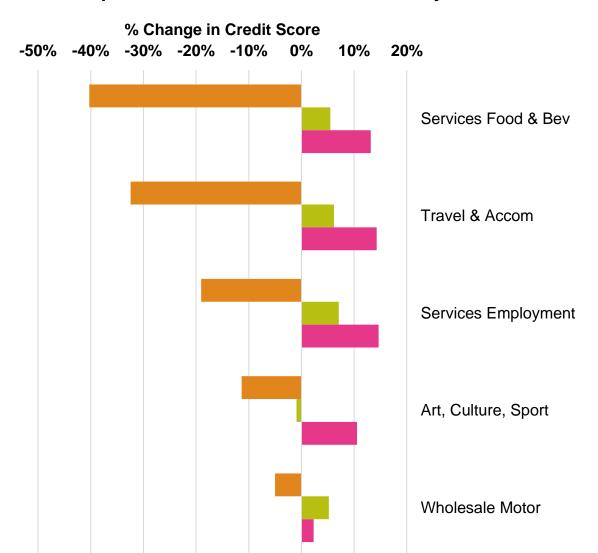


Post Covid recovery is leveling off

Early Covid period there was a drastic increase in the risk profile, especially in the hospitality and trade sectors, this is now recovering due to inflation numbers and economy restarting.

In Q1 we see the recovery curve steadying and even declining as subsidies will need to be paid back

Impact of COVID-19 on Credit Scores by Sector



Mar 2021 to Dec 2021

■ Dec 2021 to Mar 2022

Sep 2019 to Mar 2021





SME Health by Sector - 18 Month Outlook

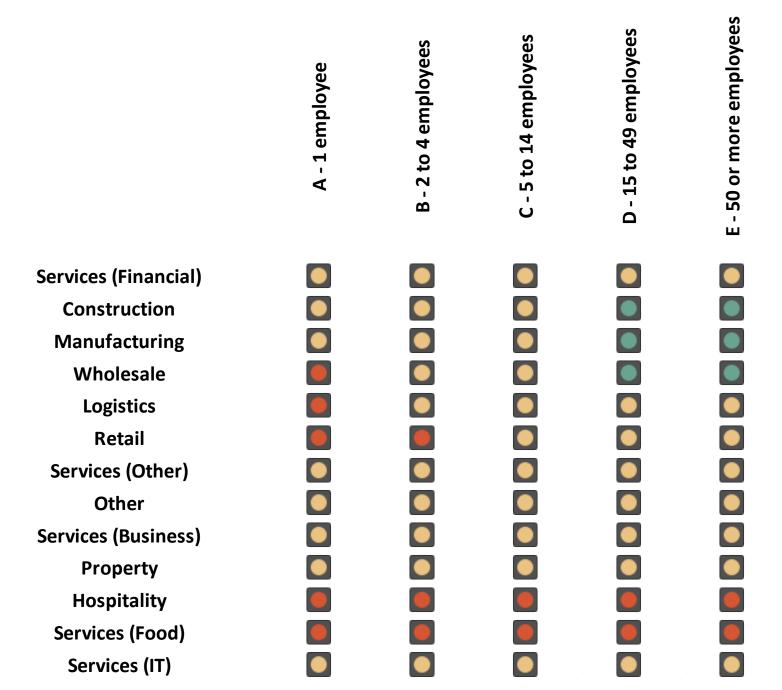




SME segment

We see recovery in all sectors to almost better than pre covid levels, however the first impact of the energy shortage and war in Ukraine is visible in the Travel and Service sector.

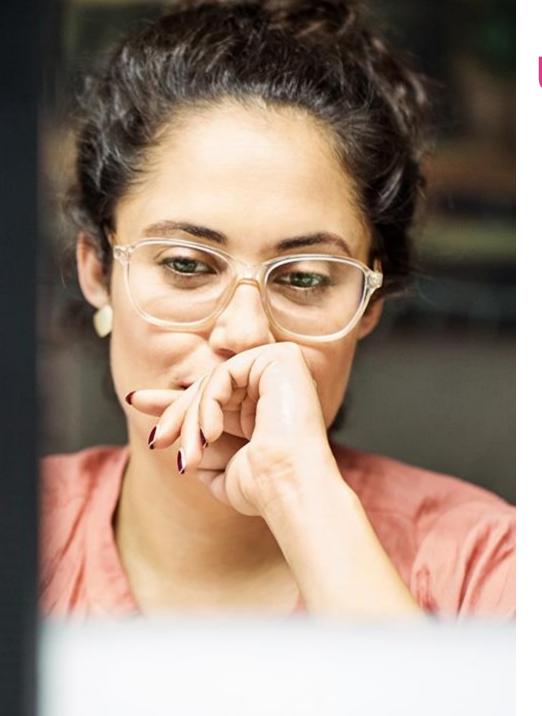




Expected Default Risk - Mar 2022 -18 Month Outlook

Across the grid most of the SME segment is still medium risk





Uncertainty in many sectors

Extending credit and doing business is more difficult now than ever before. Inflation coupled with the expected influx of bankruptcies makes taking risk a daunting prospect. But giving credit where this can be done is a reward.



Market insights every quarter

Experian produces quarterly insights on risk profiles.

Visit our Experian Netherlands LinkedIn page and follow us to remain updated.











ENJOY YOUR BREAK

We will resume at 12:10





Open Banking - Getting value from transactional data



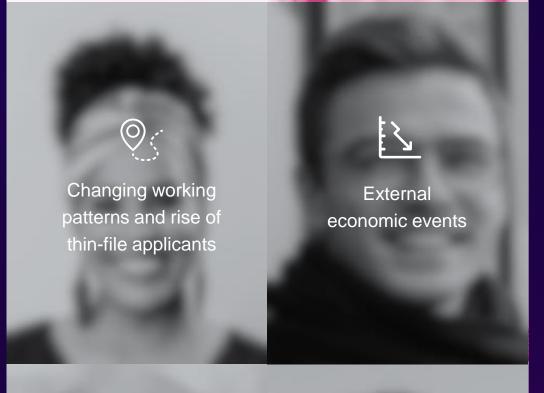
The value of transactional data

- Why transactional data is becoming so important
- What insight does transactional data provide
- How it adds value with applicable use cases





It is getting harder to understand the true picture of financial health





Desire for personalisation



Digital first consumption



If you're only using traditional data
Then you're only seeing part of your customer

Macro-economics



SME Credit Risk Projections



Macroeconomic data and forecasts

65%

Of businesses are exploring different types of data to improve accuracy of analytics

Traditional data



In house customer data



Customer behavioural data



Other 3rd party data



Credit bureau data

Non-traditional data



Web data



Unstructured internal call centre data



In house transactional data



Unstructured public "open source" data



Transactional data held with 3rd parties (PSD2)



Businesses recognise that using data more effectively is key to improve operational performance

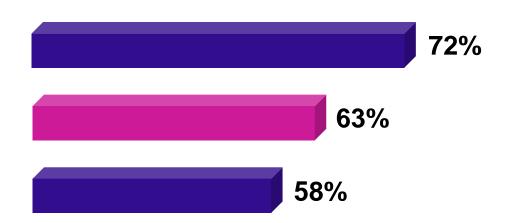
Q: Thinking about the data and insights your company uses to support operational performance, how much to you agree with the following statements?

We want to make better use of in-house data to improve operational performance

We are exploring different types of data sets to improve accuracy of our analytics (e.g., open banking)

We need more data to fuel our analytics needs

% of respondents that strongly agree or agree



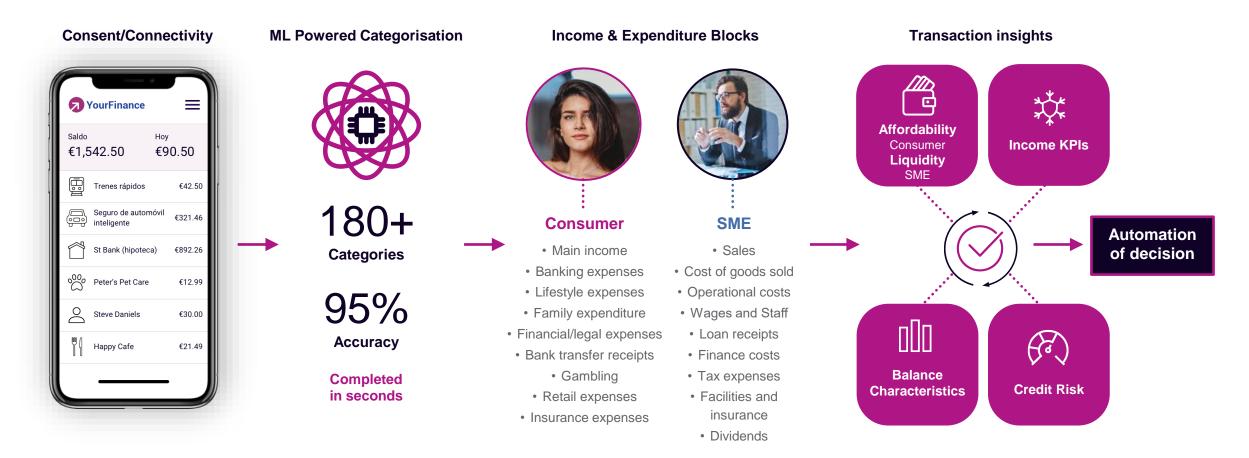






Every transaction generates data, revealing more insight into each customer

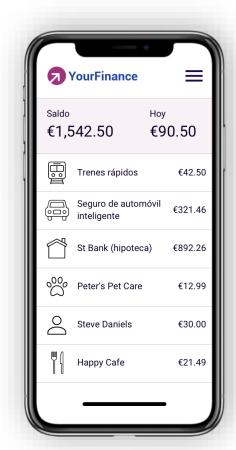
ML powered categorisation turns transactional data into **powerful insights**

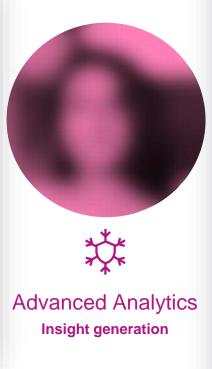


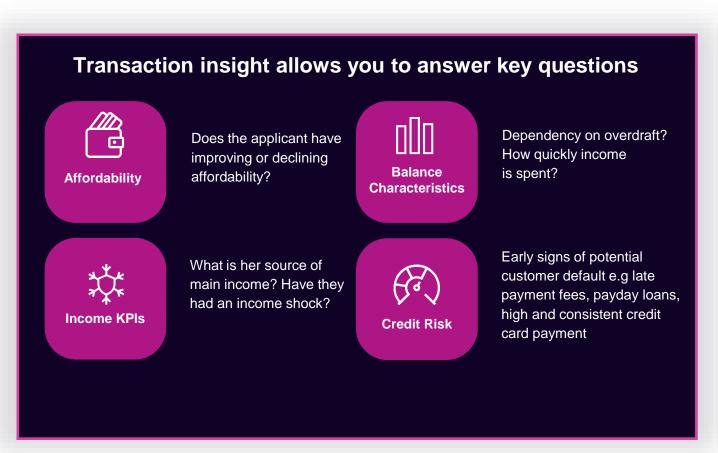




Helping answer the key questions











A rapid, in-depth understanding of creditworthiness and affordability



○ Jose

ID: 689124

Persona: Discretionary Dynamo

Finances: Comfortable **Commitments**: Low

Discretionary Spend 45%

Expenses 55%



Income Sources Eligible Income



Loans Committed expenditure



Shopping Essential expenditure



Holidays Discretionary expenditure



Low risk



Private Rent 9 Years



Single 0 dependents



IT Manager, Construction





Salary €34,000

DISPOSABLE INCOME

Avg. monthly amount

€453.00

Change **V** 5.30%

BALANCE INSIGHTS

Time spent in overdraft

0 days

Minimum balance

€2,672.00

INCOME KPIs

Avg. monthly income

€1,225.00

No. of Salary Payments

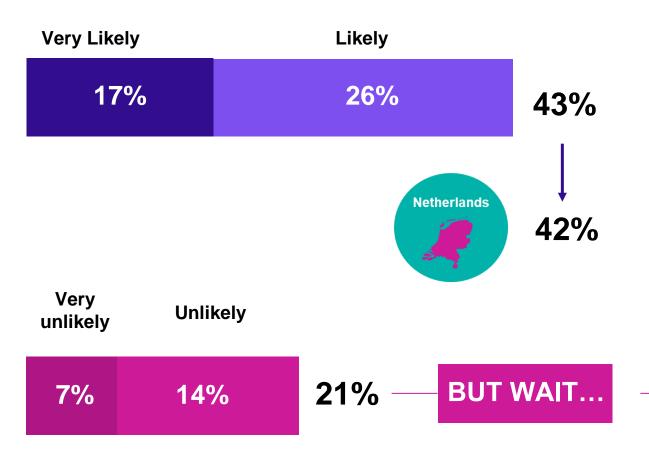
BEHAVIOURAL INSIGHTS

Avg. personal loan expenditure

€170.00

No. of loans paid last 3 months

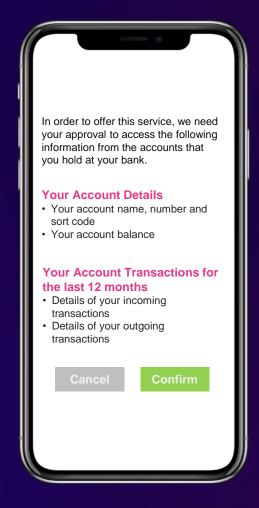
43% willing to share their financial information via banking app but many more would for the right reason

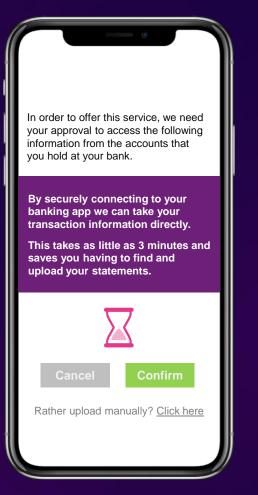


% Very Likely/Likely to give permission…		
To guarantee a faster application	38%	
To get a preferential offer (e.g., a better loan rate)	38%	
To have a better chance of being accepted	38%	
The company demonstrates that the process is secure	37%	
To ensure you did not have to send an any physical paperwork	35%	
To ensure you did not have to visit a branch	34%	



Make the value clear...to increase adoption and use of Open Banking







Where do you see the **biggest opportunity for Open Banking** from a business perspective?

LOW OPPORTUNITY			BIG OPPORTUNITY
1			10
Increased decis	sion accuracy from better data		9
Better custome	er experience	8	
Improved portfo	olio segmentation and risk analysis	8	
Faster custome	er onboarding	7	
$\leftarrow \rightarrow$ Growth from wi	dening eligibility of prospects	7	
		7	
Reduced opera	ational costs		







So, how can we use transactional insight to help your business?

We're helping clients in 4 key areas

Transactional insight and KPIs to improve affordability/cashflow and limit management

Transactional insight to enhance existing probability of default models and scores

Transactional insight to enhance Early Warning performance and delinquency management

Transactional insight to deliver improved customer experience and faster 'time-to-yes'



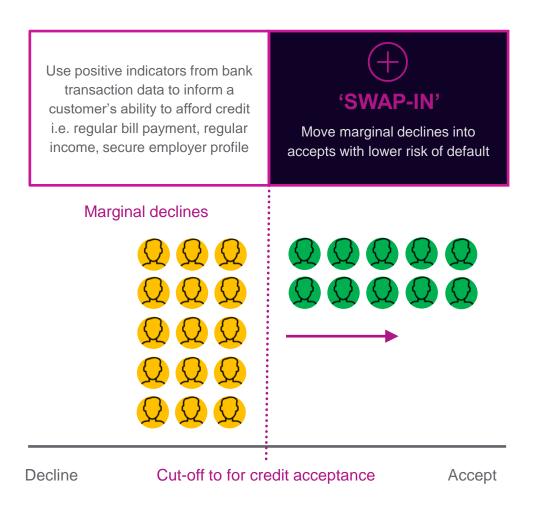


1

2

3

4



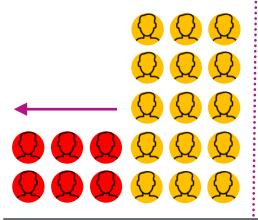
Use negative indicators from transaction data to inform a customer's probability to default on credit i.e. high gambling to income ratio, lower affordability or dependency on payday loans



'SWAP-OUT'

Move marginal declines out into declines to reduce delinquency and bad debt





Decline

Cut-off to for credit acceptance

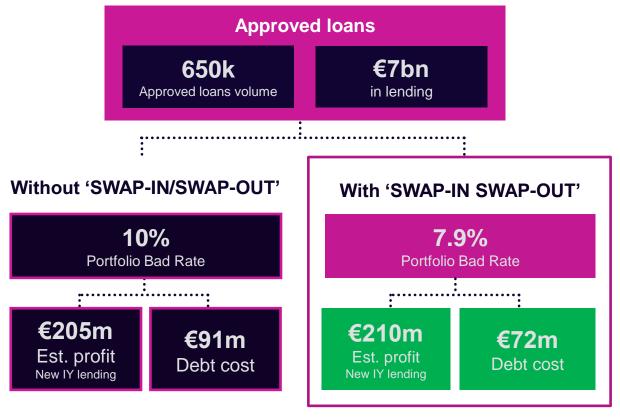
Accept

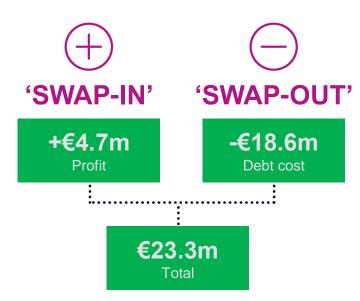




'Swap-in/Swap-out' Personal loans for Tier 1 bank

Improve understanding of affordability for marginals, increase acceptance rates and improve overall bad debt rates.





- ✓ Increased profit through higher acceptance rates
- ✓ Improved risk control for new and existing customers
 - ✓ Reduced operational costs with less defaults

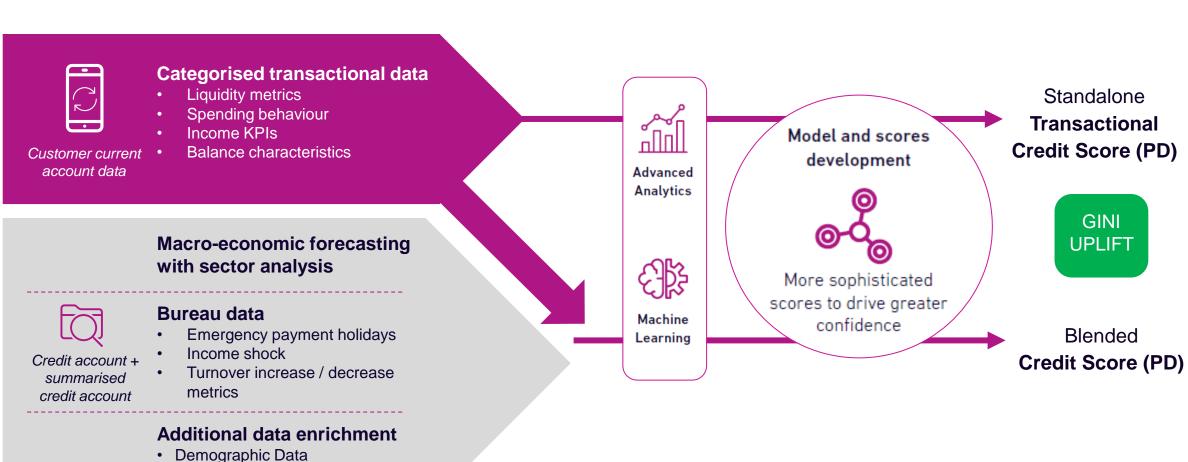
Assumptions

- 1. Based on CAIS data on current loan book (yearly accepted applications and portfolio accept rate) current coverage 3%
- 2. CAAS reduced default rates based on large bank POC
- 3. Profit based on €350 over lifetime of loan
- 4. Default cost based on €1400 per loan
- 5. Currency has been converted from £ Sterling to € Euros



Public DataWeb Data

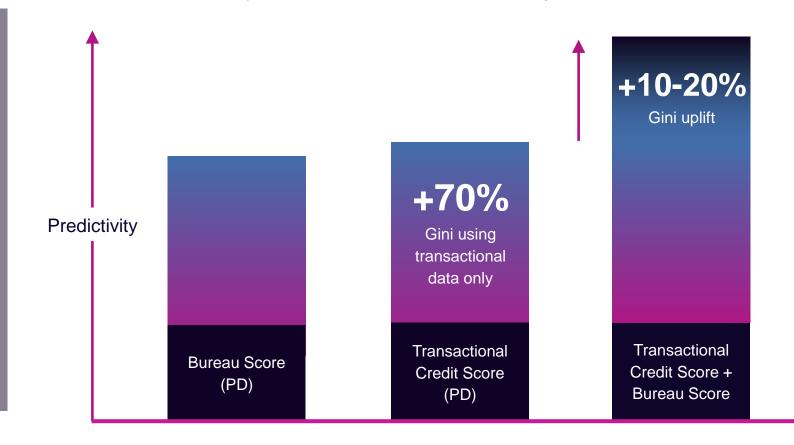
Transactional insight can be used for standalone scores or blended for greater GINI uplift



Uplift performance with more predictive models and a step up in accuracy



Transactional data KPIs are optimised for credit risk, affordability, fraud/anomalies, and churn.



+10-20%

Blended scorecards typically delivery higher predictivity than existing scorecards*

Open banking-based scores shows higher predictivity than traditional origination models and when blended with bureau data provides significant performance uplift.

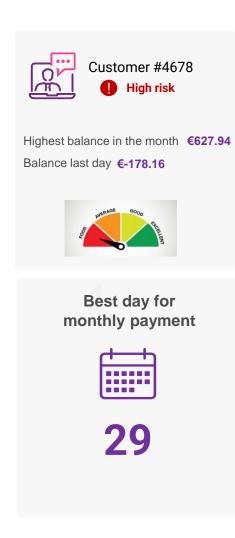


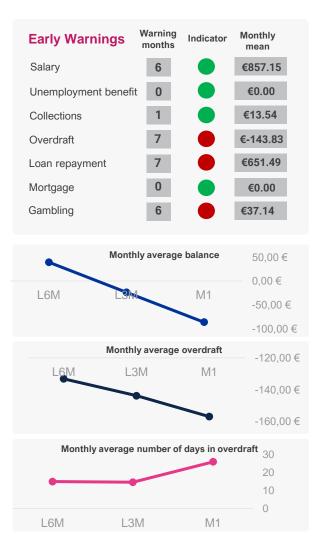
^{*}Based on existing assignments. Performance uplift for each client will differ depending on data inputs and existing performance levels.

Early collections diagnostics with personalised action

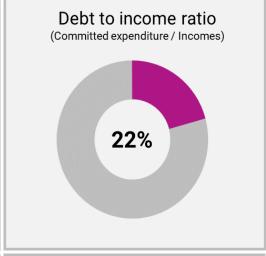
KPIs specifically designed for Early Warning and Collections

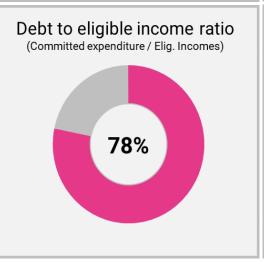
Detect early vulnerabilities by observing the evolution of the balance and overdraft. Estimate the future trends and identify best collection date via KPI analysis.

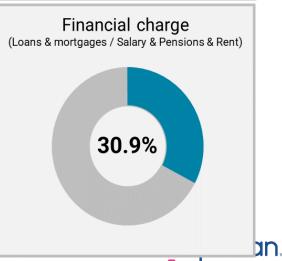


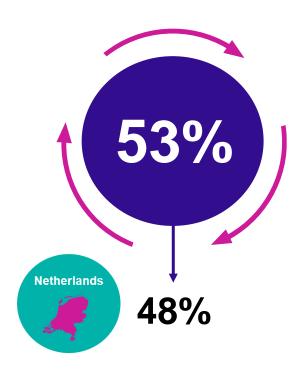












Of consumers would allow a bank or lender to access their bank transactions regularly so that it could monitor financial circumstances to provide improved financial support

"Yes, I would allow that"

AGE	18-24	25-34	35-44	45-54	55-64	65+
					45%	





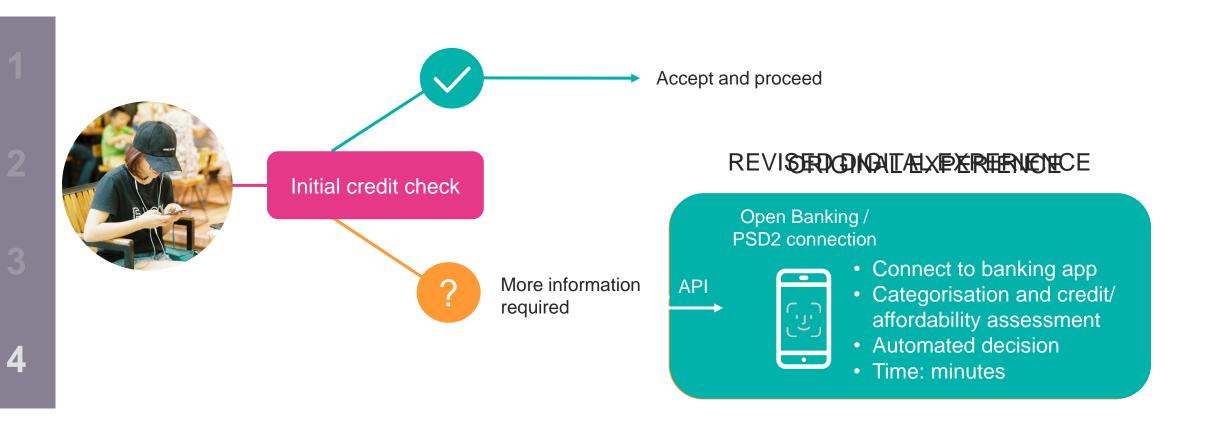
Faster customer experience and "Time to Yes"

Streamline the customer journey whilst reducing OPEX cost





Improving the customer journey whilst lowering risk





7

3

4





The future is fast approaching



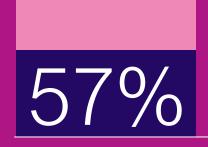
Open Banking is growing rapidly in the UK with other European markets gathering pace



The number of people choosing to share their data through open banking has tripled since the start of the Covid-19 pandemic



Experian's Open Data Platform saw more than 188 million data sharing requests (up from 47 million in February 2020)



57% of lenders have adopted open banking technology in the last 12 months

Key takeaways



Open Banking will provide increased accuracy with depth and recency key to value



Find the right use case to test Open Banking and even consider in-house data as a first test



Don't forget the **importance of communication to increase adoption** and conversion metrics

64%

of Dutch FS and Telco businesses see Open Banking as a high priority in the next 12 months





ENJOY YOUR LUNCH

We will resume at 13:30





Empower analytics through innovative data and tools





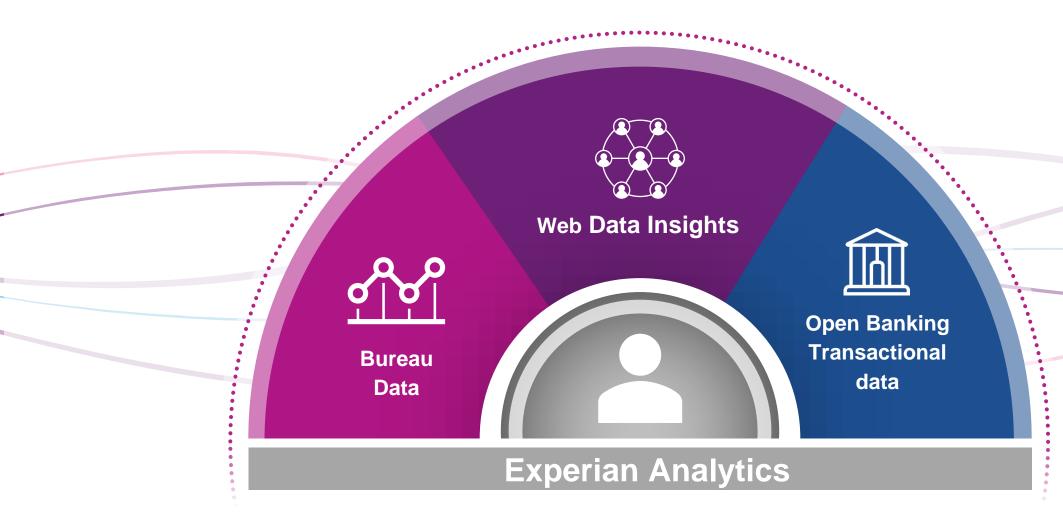


A recent study by Forrester showed that 10% increase in data accessibility will result in more than \$65 million additional net income for the typical Fortune 1000 company."

Forrester



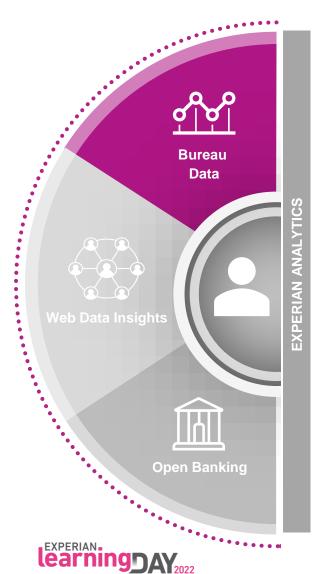
Empower your analytics with innovative data





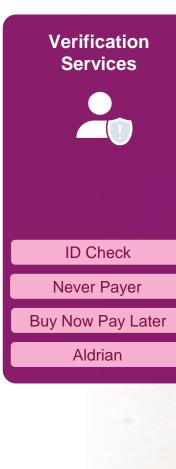


Experian Bureau Data



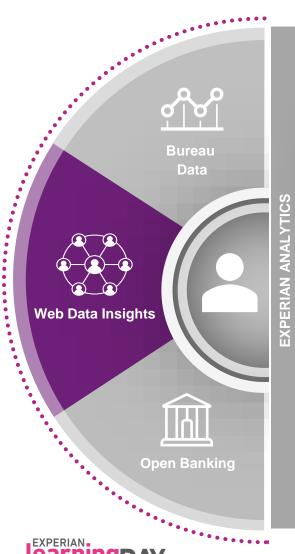








Web Data Insights



Web Data Insights uses publicly available data on companies to develop predictive ML models to enhance existing risk and fraud models.

Where it is How it can be located reached



What people are saying about it



On which sites it is mentioned





Real-time risk assessment



Compliment existing predictive models



Data coverage for all companies



Multiple use cases













France



Netherlands



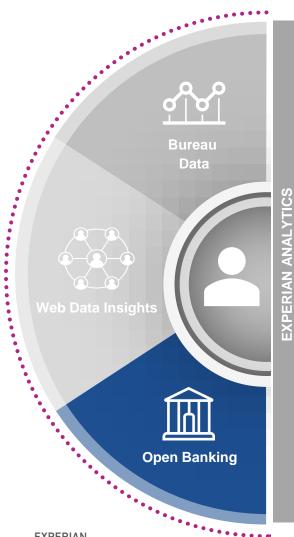








Open Banking: Transactional data



Based on explicit consent customers can share **transactional information** from their bank accounts with other banks and third parties.



Behavioural KPI from transactional or balance data



Transaction categorisation



Development Data







Consumer trust



Computing power





How to use data in existing process?

Policy KO Rule

Derive knock-out criteria based on own business driven threshold



Accept



Refer



Reject

Model Risk Drivers

Use information as risk driver within model development

Target = $\mathbf{f}(X1, Experian, Xn)$

Risk Matrix

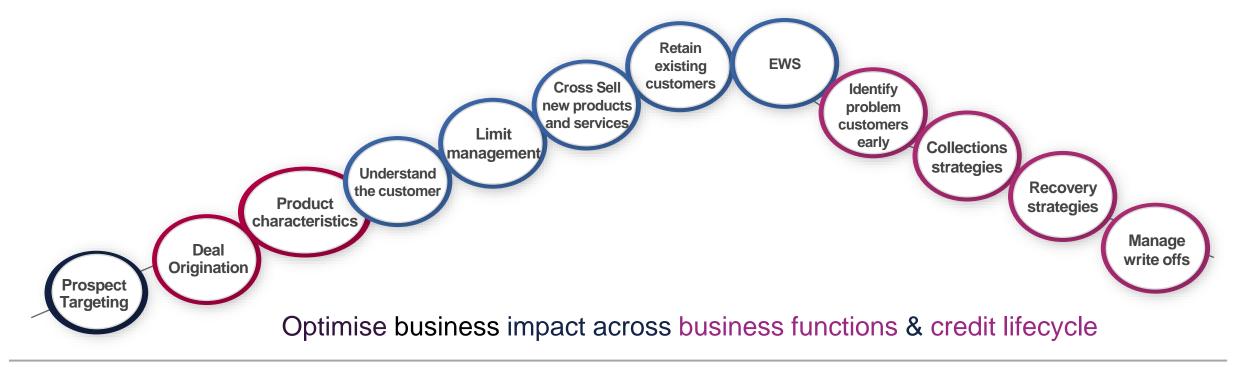
Combine insight with current risk assessment in a risk matrix

	C01	CO2	CO3	C04	C05	C06	C07	C08	C09	C10
W1	54.0%	32.8%	32.8%	20.5%	13.7%	9.5%	6.5%	4.1%	3.0%	3.0%
W2	20.5%	13.7%	9.5%	9.5%	6.5%	4.1%	3.0%	1.9%	0.8%	0.8%
W3	13.7%	6.5%	6.5%	4.1%	3.0%	1.9%	0.8%	0.8%	0.5%	0.5%
W4	6.5%	4.1%	1.9%	1.9%	1.9%	0.5%	0.5%	0.5%	0.5%	0.1%
W5	4.1%	1.9%	0.8%	0.8%	0.5%	0.5%	0.1%	0.1%	0.1%	0.1%





Optimize business impact across the credit life cycle using innovative data



Prospecting Origination Customer management Collections & Recoveries





Agile data strategy



Additional insights in uncertain market conditions



Optimise data management efforts & maintenance costs



Experienced use cases



Privacy by design







ESG Score - The Experian approach



Why all financial industry will move quickly

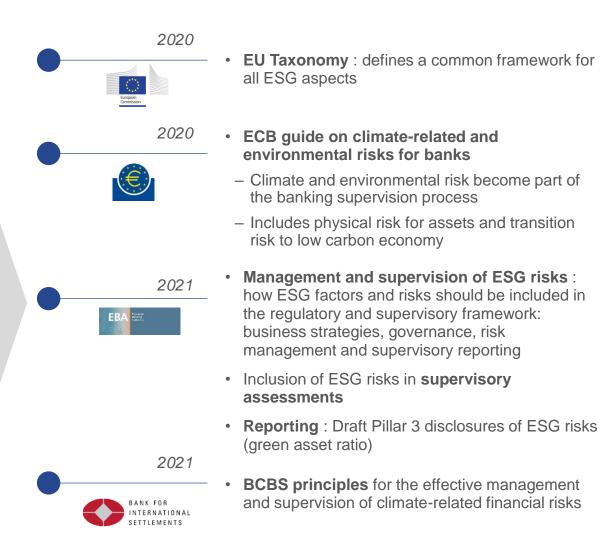




In recent years, EU has accelerated its propositions to promote a sustainable economy, with direct additions to banking regulation



neutral in 2050





Examples of environmental factors

FACTOR		INDICATOR	METRIC	
ENVI	RONMENTAL FACTORS 221		2101	
	Production of GHG/ CO ₂ emissions	Total GHG emissions (broken down by scope 1, 2 and 3 carbon emissions)	Tonnes of CO ²	
		Carbon footprint	Tonnes of CO ²	
		Fossil fuel sectors	% or total	
93		Lack of reduction initiatives in the use and production of fossil fuels	% or total	
and		Compliance with Paris Agreement targets		
Climate Change		Lack of initiatives to reduce GHG/ CO ₂ emission		
Clin	Energy efficiency	Energy consumption intensity	In Gigawatt hours(GWh)	
		Use of renewable sources of energy	% or total	
		Lack of initiatives to reduce the use of non-renewable energy		
		<u> </u>		

Environmental factors will be aligned with the EU Regulation and the EU taxonomy

- Climate change mitigation
- ☐ Climate change adaptation
- ☐ Sustainable use and protection of water and marine resources
- ☐ Transition to a circular economy
- □ Pollution prevention and control
- ☐ Protection and restoration of biodiversity and ecosystems





Examples of social factors

FACTOR	INDICATOR	METRIC		
SOCIAL FACTORS 223				
Community/ Society	Relations with local communities (networks)	Establishment of business in rural and economically and socially underdeveloped areas		
	Social impact of products and services	Products' potential to reach rural areas and groups of society where development gaps exist		
	Freedom of association and right to organise	Observation and implementation of due diligence policies on issues addressed by the fundamental ILO Conventions 1 and 2		
Employee	Forced labour	Observation and implementation of due diligence policies on issues addressed by the fundamental ILO Conventions 3 and 4		
relationships/labour standards	Minimum age and child labour	Observation and implementation of due diligence policies on issues addressed by the fundamental ILO Conventions 5 and 6		
		Observation and implementation of due diligence policies on issues addressed by the fundamental ILO Convention 7		
	Equal remuneration	Average gender pay gap		
	•	Average ratio of the annual total compensation for the highest individual to the median annual total compensation for all employees (excluding the highest-compensated individual)		
	Discrimination	Observation and implementation of due diligence policies on issues addressed by the fundamental ILO Convention 8		

Social factors will be grouped based on the main stakeholders of the society

- ☐ Society as a whole
- **☐** Employees
- **□** Customers
- □ Stakeholders





Examples of governance factors

FACTOR	INDICATOR	METRIC			
GOVERNANCE FACTORS 22	4 225				
	Integrity of conduct/conduct frameworks	Alignment with the OECD Guidelines for Multinational Enterprises and UN Guiding Principles on Business and Human Rights			
	Values and Ethics	Alignment with the Charter of Fundamental Rights of the EU			
Ethical considerations		Compliance with United Nations Convention against Corruption			
	Bribery and corruption	Identification of insufficient actions taken to address breaches in procedures and standards of anti-corruption and anti-bribery			
		Convictions and violations of anti-corruption and anti-bribery laws (Number of cases and amount of fines)			
	Accountability /Rule of law	Alignment with the Worldwide Governance Indicators (World Bank)			
Strategy and risk	Strategy Implementation, Operational Execution and monitoring	Alignment with the OECD Guidelines for Multinational Enterprises and UN Guiding Principles on Business and Human Rights			
management	Internal controls and risk management policies and procedures	Alignment with the OECD Guidelines for Multinational Enterprises and UN Guiding Principles on Business and Human Rights			
Inclusiveness	Discrimination	Gap between males and females or any other minority groups in the given region in education access and/or outcomes, representation in government positions and/or boards, salary income, etc.			
		Lack of a diversity strategy in place (e.g. age, gender, minority groups)			

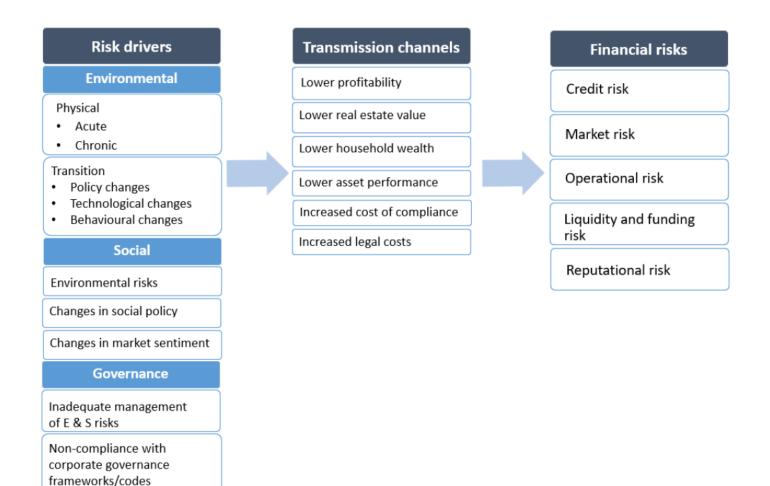
Governance factors will be grouped across four main categories

- Ethical considerations
- ☐ Sound risk management structures
- □ Organization
- ☐ Functioning of the management body and transparency



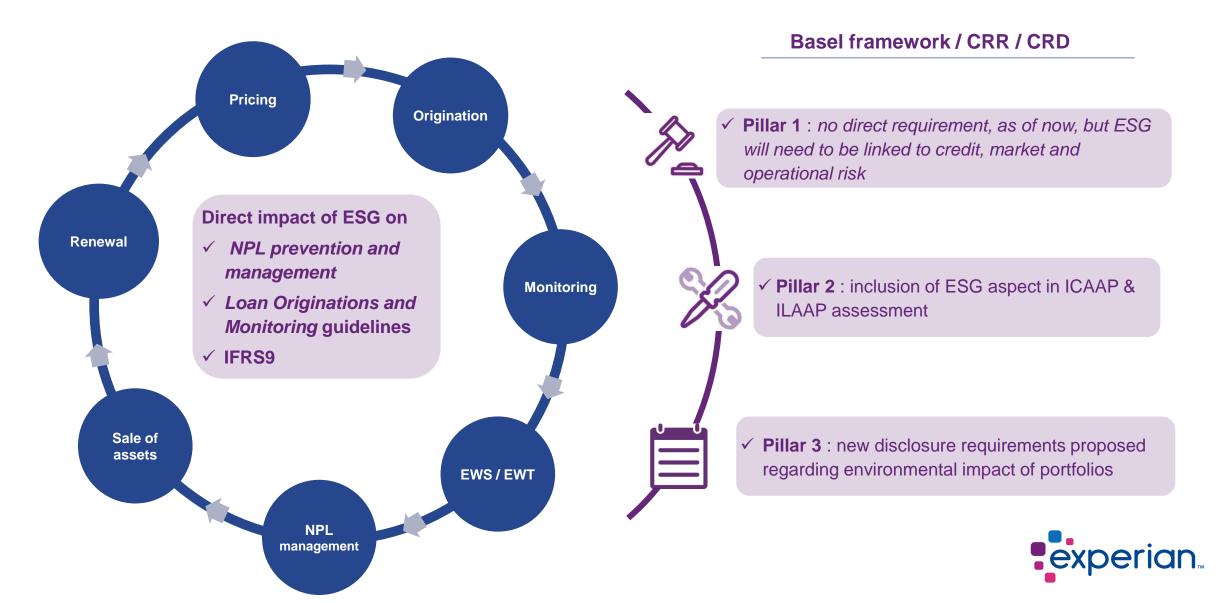


ESG risk drivers, their transmission channels and impact on financial risk categories





ESG risks impact the whole credit lifecycle, and as such are also being included in the existing regulatory framework



Key pillars and supervisory expectations for credit institutions

Business Models and Strategy



BusinessEnvironment

Understand the impact of ESG (climate-related and environmental, social and governance) risks on the business



☐ Business Strategy
Integrate the ESG risks in the business strategy

Governance and Risk Appetite



■ Management body

Consider ESG risks when developing longer-term business strategy and objectives



□ Risk appetite

Include ESG risks in the risk appetite framework



Organizational structure and reporting

ESG roles and responsibilities of management and 3 lines of defence. Reporting of ESG risks

Risk Management



☐ Risk management framework

Incorporate ESG risks indicators as categories in the risk management framework:

- Credit risk at all stages of the lending
- ✓ Operational risk
- ✓ Market risk
- ✓ Liquidity risk



Stress testing and scenario analysis

Include ESG risks in the baseline and adverse scenarios

Disclosure



□ Policies and procedures

Disclose information and key metrics related to ESG risks



☐ Disclosure of assets affected by climate change

Series of templates included in Pillar 3, including Green asset ratio



Impact of C&E physical and transition risks on risk management

Dieke	Physica	al Risks	Transition Risks		
Risks	Climate Environmental		Climate	Environmental	
	 Extreme weather Chronic weather patterns Resources scarcity Pollution Biodiversity loss Soil deterioration Other 		 Policy and regulation Technology Market sentiment 		
Credit	PD and LGD of sectors and geo physical risks	ographies vulnerable to	Energy efficiency standards may trigger high adaptation costs and low profitability, leading to higher PDs and lower collateral values		
Market	Severe events may lead to shifts in market expectations, repricing assets and causing market volatility		Transition risks may generate sudden repricing of securities and derivatives		
Operational	Banks' operations may be disruptional branches and offices	pted by physical damage to	Changing consumer sentiment towards climate issues may lead to reputational damage for the bank		
Other (liquidity, business model)	damage to properties, radiities, etc.		Transition risk drivers may affect the viability of some business lines and lead to strategic risk for some business models Abrupt repricing of securities may depreciate the banks' high-quality assets		



Global Score: a solution for ESG risk management

Lenders *must comply* with *regulation* that ask to supervise and manage ESG risks of BI portfolio. We want to provide an end-to-end solution that through data, analytics and Experian platforms can allow to *monitor BI portfolio* - with low IT impact – and *measure impact in credit risk with stress test scenario*.



Experian can help banks to monitor BI portfolio complying with ESG regulation to measure ESG impact in credit risk stress tests

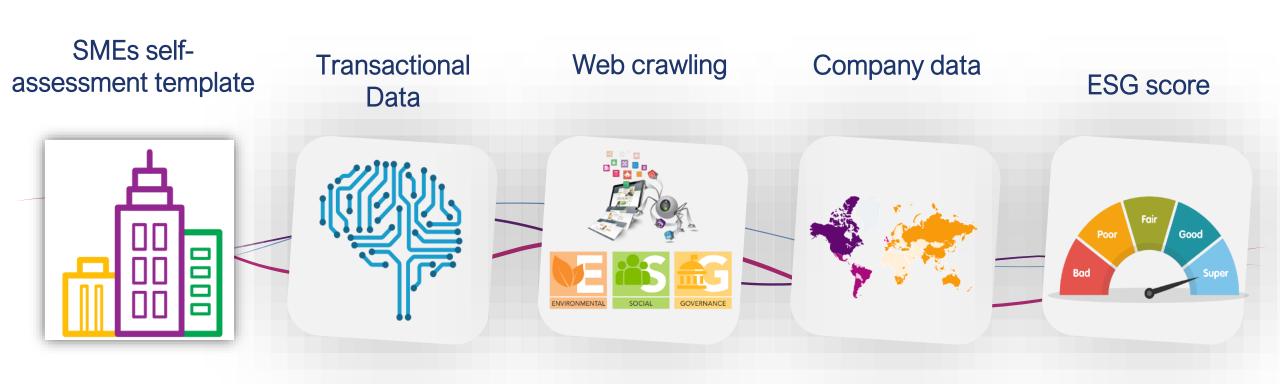


Proposed solution

Risks Environmental Social Governance Experian Approach Web score to gather information from the internet space and link that to pre-defined categories for environmental, social and Web score governance risks The customer will fill in questionnaires to provide information for important financial parameters (EBIDA, number of employees, Questionnaires investments, etc.), business information, environmental risks to the entity and its counterparties, social risks and governance structure. Self-assessment tool – predefined questions and list of possible answers and ranges provided by Experian Score based on transactional data to Transactional data measure spending in terms of electricity, fuel, water, etc. Data coming from business information Data coming from business information Business information providers (like Apis and ICAP). Financials, providers (like Apis and ICAP). Financials, employees, location, business sector employees, location, business sector When the relation to climate changes is estimated climate scenarios can be used to estimate medium- and long-term impact on the business of the client – its customers and Climate Scenarios suppliers. Experian can provide climate impact scenarios from NiGem platform



Global Score – Companies



How Can Experian Help?

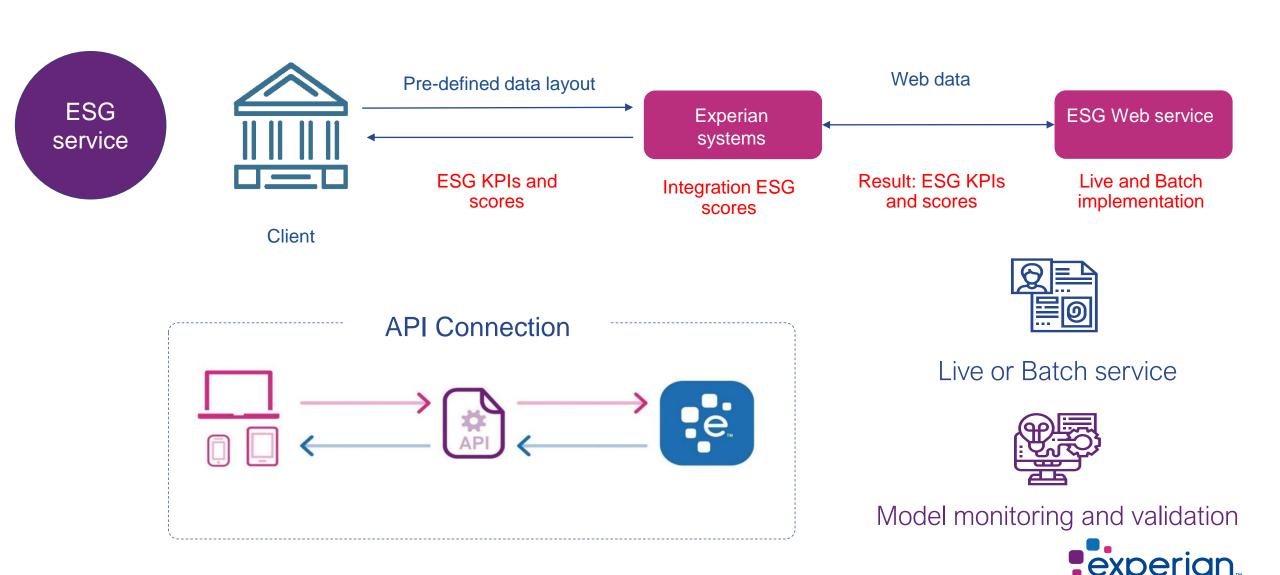


- √ Advanced analytics to capture and analyze ESG data
- √ Web-based data to capture timely information on ESG
- ✓ Individual assessment of ESG risk of each exposure :
- Transparent, simple and can be linked to KPIs used in the organization / systems
- Established methodology, using multiple criteria on each dimension of the ESG

- ✓ Risk framework method, sensitivity analyses to analyze dynamic impact of ESG:
- Forecasts that account for ESG risks, including their feedback loops
- Capacity to handle regional and sectorial analysis
- Consultancy and data support to EBA's
 2022 Climate Change Stress-Test
- ✓ Integration of ESG metrics in business strategy, governance and risk management
- ESG integration into credit risk evaluation process and credit decisioning
- Development and delivery of new generation Risk Management, Loan Origination and Monitoring models, EWS and triggers that are forward-looking and incorporate ESG impact



Proposed Design





Artificial Intelligence and Machine Learning regulations





Artificial Intelligence and Machine Learning regulations



.01

Why **ML models** will become the new normal

.02

Why **Explainability** is the key to unlocking the ML potential

.03

5 tips for implementing ML with Explainability







The output of a statistical model is explainable when its internal behaviour can be directly understood by humans (interpretability) or when explanations (justifications) can be provided for the main factors that led to its output.

Businesses see the potential

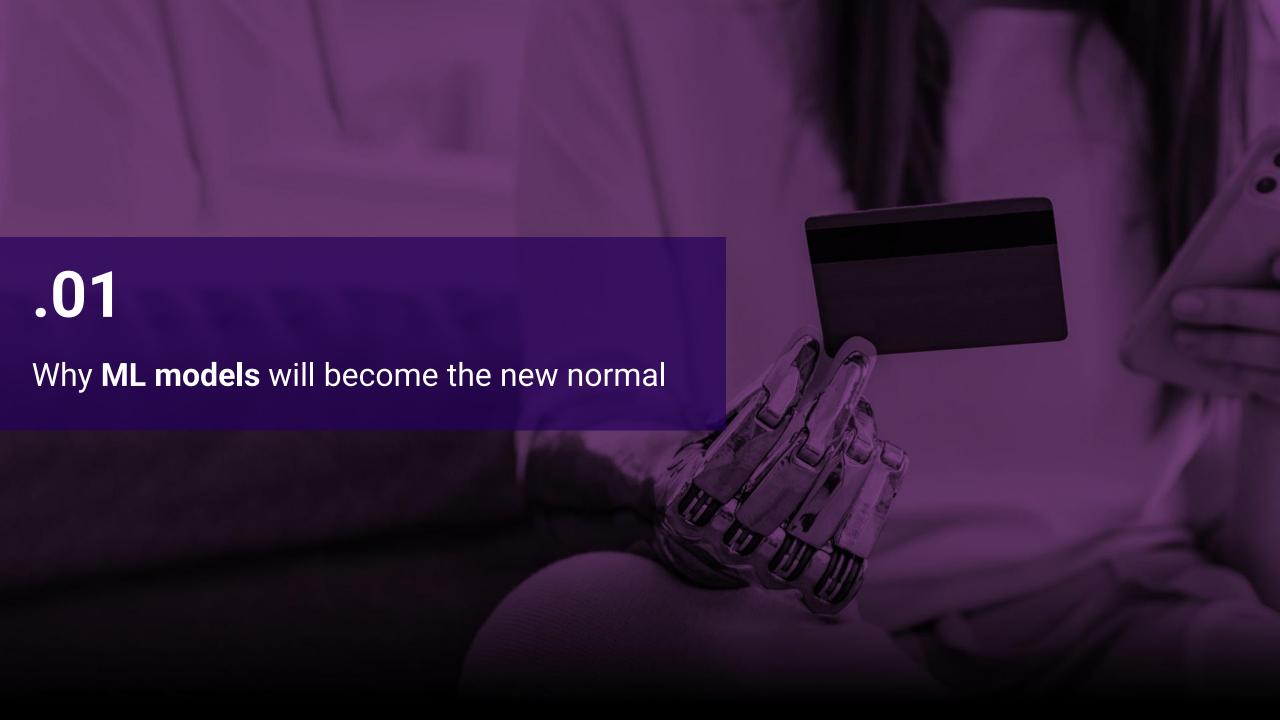
66%

of organisations state that adopting Advanced Analytics capabilities is a top business priorities over the next 12 months 53%

of businesses plan to engage with an external supplier for support with Al or Machine Learning in the next 12 or 24 months of businesses have increased their budget for Advanced Analytics for next 12 months

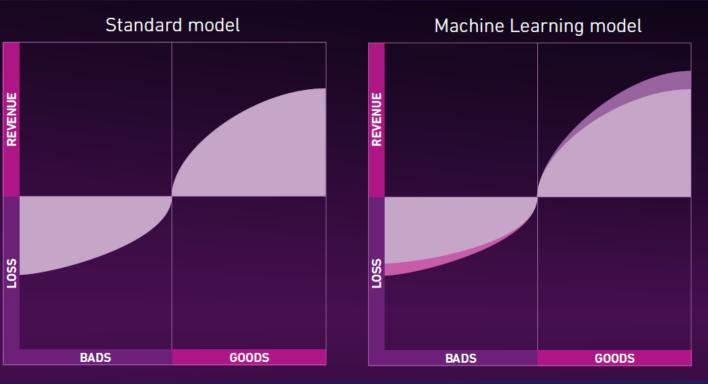
of businesses believe Advanced Analytics, including Al and Machine Learning, are going to radically change the way they do business



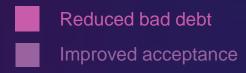


The more predictive and accurate the model the more profit realised

ML can deliver significant model performance improvement which translates to improved acceptance and reduced bad debt.



ML models allows you to more accurately assess "goods" and "bads" whilst lowering operational costs.



The ML effect: ML fraud model helped Telco client prevent fraud loss with increased accuracy

Combatting first payment default



ML in risk: Development of a custom credit risk score for a bank using Machine Learning

Business moved from a regression model to an ML-based model to increase acceptance and grow customer acquisition

PREVIOUS APPROACH

The bank used a traditional logistic regression-based risk model for new account decisioning to predict probability of default in the 18 months following loan approval.

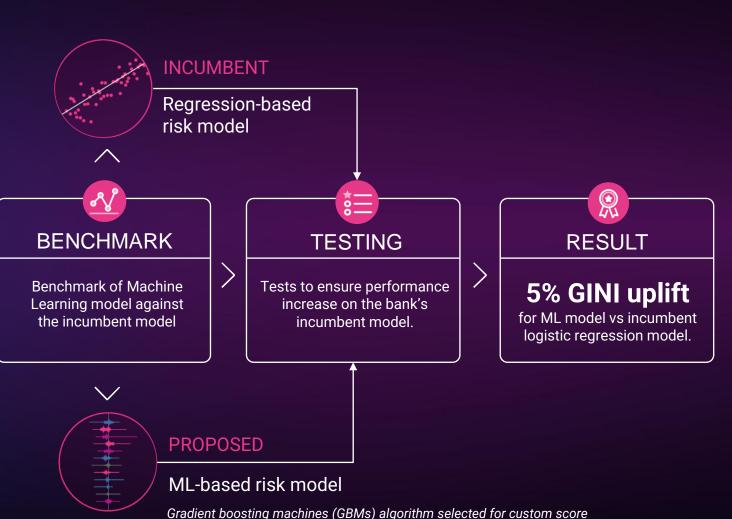


OBJECTIVE

Regional bank wanted to aggressively grow its indirect loan portfolio

PROPOSAL

Decision made to test use of Machine Learning (ML) model with greater predictive power to generate higher loan approval rates and reduced risk.



development. This type of algorithm is highly predictive and offers more transparency than some other machine learning frameworks such as neural network models.

Full transparency with ability to derive adverse action codes for reject decisions

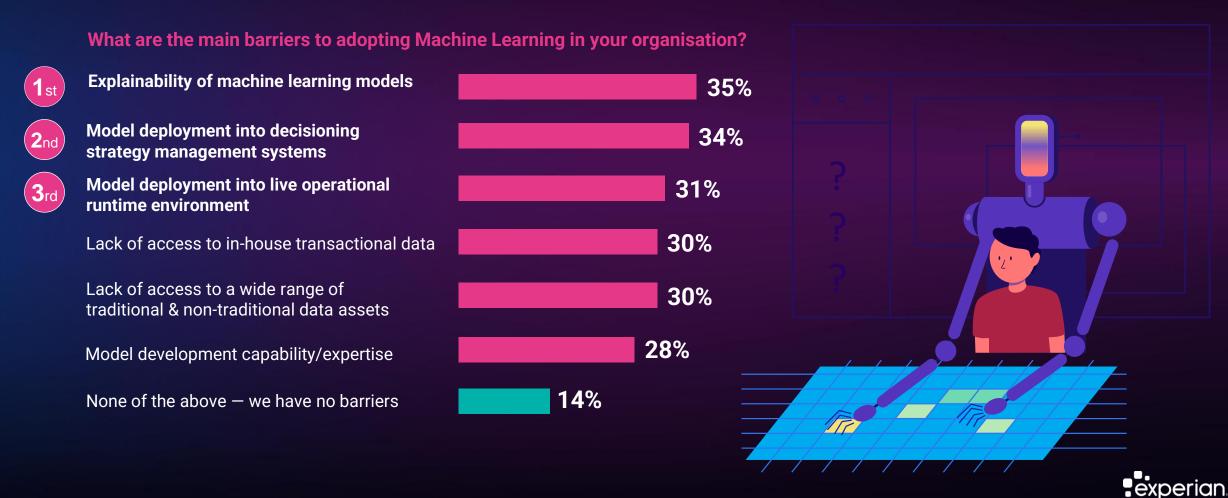


Improved predictive performance led the to replacement with ML model.

Bank achieved goal of increasing application approval rates and reducing risk within indirect loan portfolio.

But to effectively implement ML you must provide explainability... and lack of explainability is the single biggest barrier to ML adoption

Understanding why a model has produced a certain output is a critical factor when optimising credit risk management







We've progressed to a point where businesses can get the uplift from complex ML but now with the ability to provide explanation of outcome

Breaking out of the black box

Avoids "blackbox" problem

Past State

Simple deployment but lower performance



Statistical Modelling



Statistical solutions or simplified Machine Learning models (e.g. decision trees)

Playing safe

Avoid embracing new ML methodologies but limiting business model

Achieving better performance but losing explainability and control



The "Black-Box" solution



The risk of developing improved models but without knowing how they work

Regulatory pressure

With new regulations paying special attention to nontransparent solutions, the "black-box" approach is ending Gain control over features and models

Meet regulatory requirements

Outcomes that can be explained to customers







New State

Advanced approach with Explainability



Models with improved performance now able to provide explainable results

Revised approach

Explainable models and decisions with reduced IT effort and cost

SHAP value explained

Imagine two things



A game

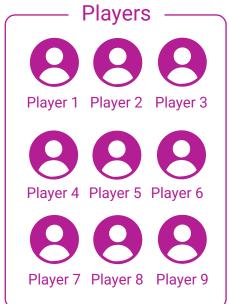
The "game" is reproducing the outcome of the model



The players

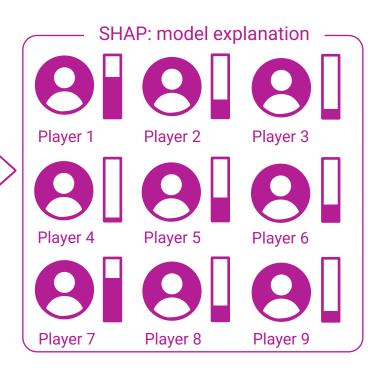
The "players" are the features included in the model.

Imagine now that we have a predictive model









Relative contribution to outcome



What Shapley does is quantify the contribution that each player brings to the game.

How does this apply to machine learning explainability? SHAP does the same thing for the model by quantifying the contribution that each feature brings to the prediction made by the model.

This allows us to understand the features that contributed most and least to the result. From that we take a confidence level and understand the importance of the individual features that enables the decisions to be **explained** and **interpreted**.







5 TIPS FOR IMPLEMENTING ML WITH EXPLAINABILITY

- 1 Improve outcomes for borrowers: ML allows for individualised credit scores that better assess borrowers' creditworthiness
- 2 Reduce the cost of lending: By increasing efficiency in risk management, ML models can lower the costs of lending
- Better decision-making: ML helps provide objective, consistent, decisions through analysis of borrowers' relevant credit data.
- **Support financial inclusion**: ML supports access to credit for certain groups that may otherwise have limited access
- **Enhance accuracy**: ML is more sensitive to real-time indicators of creditworthiness, such as current level of income, and forecasted earnings.

Experian has developed a standardised framework for developing and deploying ML models with the required level of explainability

- 1 Business Understanding
- 2 Data Understanding
- 3 Data Preparation

50% faster

Experian has improved methodologies to bring 50% faster time to value on the traditional modelling steps.

Enriched process

The process has been further enriched with a standardised and innovative framework for the required level of explainability.

- 4 Modelling
- 5 Evaluation
- 6 Deployment & Production
- 7 Monitoring and Validation

Machine Learning Explainability

- 1 Relative Feature Importance ••• By calculating scores for each feature, you can determine which features attribute the most to the predictive power of your model.
- 2 Partial Dependencies
- A partial dependence plot can show whether the relationship between the target and a feature is linear, monotonic or more complex.

SHAP Values

SHAP Values shows the average expected marginal contribution of one attribute after all possible combinations have been considered.

Working with Experian: you can now ingest, map and deploy ML models without the need to invest heavily in data scientists and developers



Our Explainability plugin is compatible with tree based ML models imported in PMML (Predictive Model Markup Language) such as Random Forest and Gradient Boost.



The PMML model and training data is imported into the plugin offline.



Before production we work with you to verify that all explanations support regulatory compliance.



Explanations are produced in the form of variable importance values which are automatically added to the model and can be easily converted to reason codes.



This outcome data enables you to continuously improve your ML decision logic – enhancing your decision strategies and customer outcomes.



Thank you

