



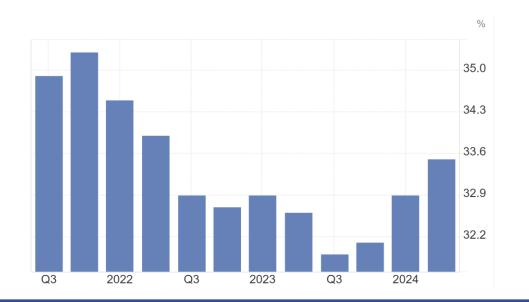
Changes in data: 2019 – 2024 Sample dataset

| Income Brackets | Credit Score | Instalments | Total Accounts | Current Balances | Amount Overdue |
|-------------------|--------------|-------------|----------------|------------------|----------------|
| > R2500 | 2% | -29% | 9% | -33% | -53% |
| R2500 - R5000 | -9% | 27% | -2% | 5% | 26% |
| R5000 - R7500 | -17% | 16% | -3% | -24% | 8% |
| R7500 - R10 000 | -10% | 14% | 2% | -21% | 146% |
| R10 000 - R15 000 | -10% | 16% | 3% | 36% | 11% |
| R15 000 - R20 000 | -21% | 50% | -6% | -3% | 110% |
| R20 000 - R30 000 | -13% | 54% | -5% | 22% | 197% |
| R30 000+ | -10% | 57% | -6% | 24% | 161% |



What we see

- 36% of Credit Active consumers in current status
- 40% of consumer expenses in Credit Report
- 52% of Grant recipients has adverse credit records
- Unemployment rate increased to 34% (43%)
- Youth unemployment rate 61% (71%)
- SA unemployment rate highest in the world 24m individuals









Scope — Financial Inclusion

- 91% of South Africans have access to formal financial products & services
- Estimated 3.6m still excluded
- Of the 91%
 - 81% has a bank account
 - 78% use other non-bank financial products & services



Considerations

- Consumer education should underpin all strategies
- Over-indebtedness / Reckless lending
- Reckless credit provisioning
- Entry-level bank accounts used as monthly cash distribution service cash-in/ cash out.
- 31% of banked population use account >3x pm
- Remittances money transfers outside country
 - 48% via banks
 - 55% via retailers
 - 35% via informal channels
 - SA contributes > 51% of GDP of 16 SADC region
 - 2.9m migrant workers residing in SA





Barriers

- Inadequate use of bank accounts
- Underdeveloped payment options
- Low levels of formal / regulated remittances
- Low savings rate in traditional formal sector
- Low take-up of Insurance products (other than funeral, credit life and legal products)
- Over-indebtedness
- Inadequate leveraging of opportunities from Social grants
- Low levels of client onboarding perceived onerous regulatory requirements





> Financial Inclusion Definition

- Financial Inclusion call for
 - availability of mutually, beneficial & sustainable products and services for target population
- For Financial Service Providers stresses existence of an enabling environment for
 - Competition
 - Innovation
 - Product Development
 - Delivery
 - Greater diversity in tyPes of regulated financial service providers





Pathway to Financial Inclusion

- Basic transaction account
- Unsecured credit accounts
 - Funeral insurance
 - Credit cards/ overdrafts
 - Retail accounts
- Secured credit
 - Vehicles
 - Homeloans
- Asset / Medical Insurance, LT Savings/ Investments
- Other investment products / Unit trusts etc
- Other sophisticated products and services





Types of Credit Bureaus in SA

- Primary hosting bureau
 - Credit and Data providers
- Niche Credit Bureaus
 - Holds specific types of data
 - Municipal data CrossCheck
 - Medical Credit Data MCW
 - Tenant rental Data TPN
 - School fees TPN
 - Legal entities Data Inoxico
 - Qualifications Data MIE
- Reseller Credit Bureaus.

Total of 54 and growing....



Alternative Data

Data from non-traditional goods and services providers

- How they use their cellphone
- What and when they purchase loyalty cards
- How they pay their non credit bills
- Where people stay
- Employment info
- Pre-paid cellphone info
- Online shopping spending patterns
- Medical accounts / payments
- Utility payments
- School / Educational fees
- Driving behaviour
- Social media & Online behavior
- Health information

All these information can be utilized to profile an individual to supplement/ verify traditional credit scoring but also provide scoring where they do not have a credit score.





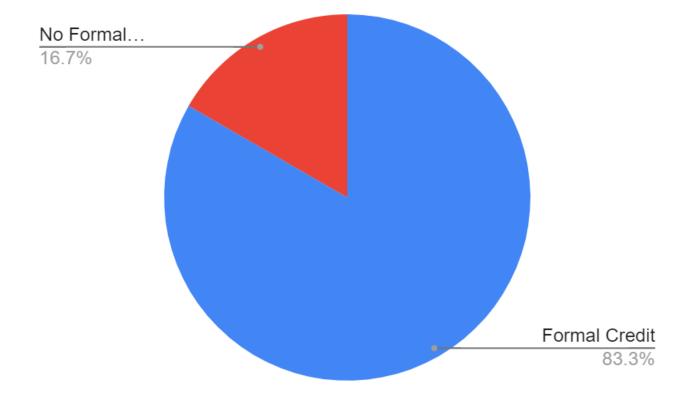
Insights from Alternative Data



Alternative Data: Company Owners and Directors

- Business owners/ Directors

 without formal credit
 records can indicate
 behavior that could be
 considered for profiling
- Challenge with cash transactions could skew this

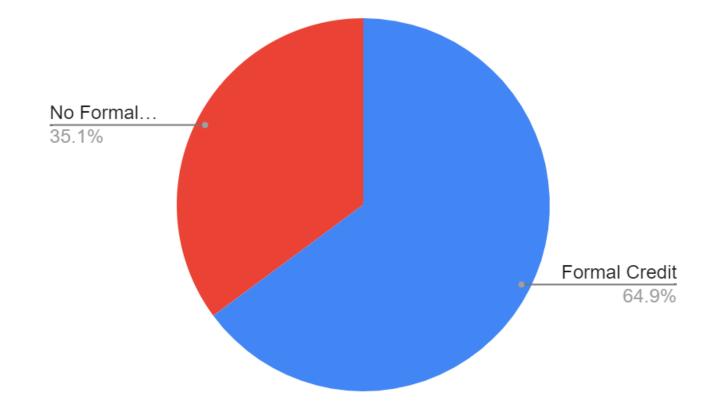






Alternative Data: Utility payments

- CrossCheck holds data on millions of utility accounts (water, electricity, rates and property taxes)
- When used to augment traditional formal credit data, we were able to derive considerable value



INTRODUCING **CPB BASKETSCORE:**

Credit Risk Scoring using Alternative Data





Solving for Financial Inclusion





- Does not provide any insights on customers with no formal credit products
- Can be a blocker for underserved individuals





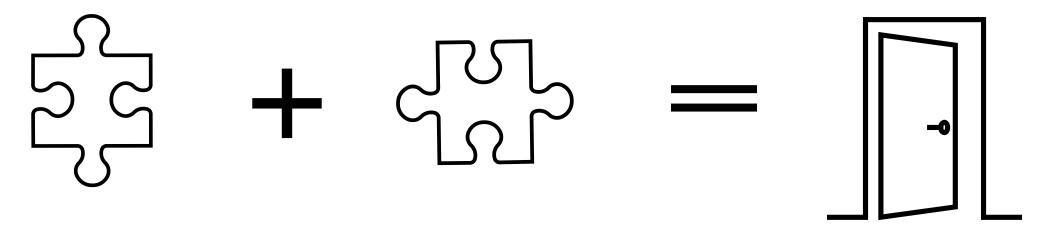


Alternative data sources:

- Offers unique insights beyond traditional credit history
- Is inclusive for underserved communities



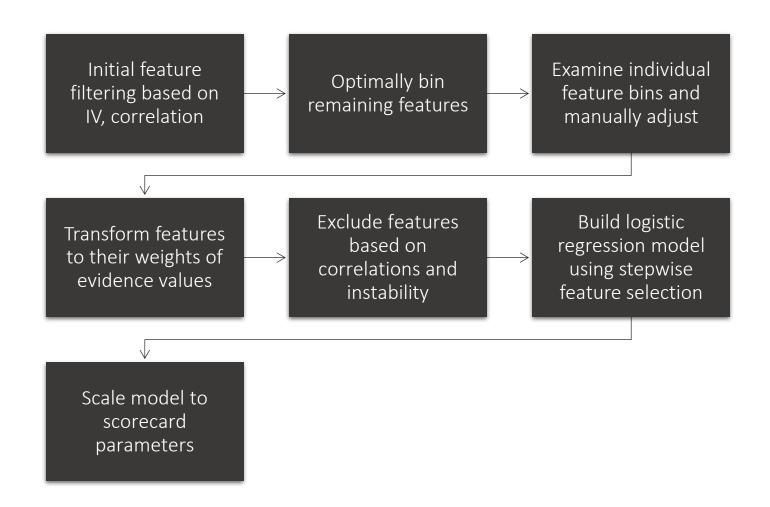
Data sources



 Model Input Features based on Retail Shopping and Customer Demographic Data Model Target based on Credit Bureau Payment Profiles for short-term Personal Loan Accounts Generic Market-Level Credit Risk Score that facilitates Financial Inclusion and Fair Pricing



Model Development Methodology





Scorecard Scaling

- Base score = 660
- Base Good/Bad Odds = 30
- Points to Double the Odds = 40
- Rate = 2
- Score can range from to 399 to 615





Production Model Characteristics

Includes:

- Features based on consumer behavior over the previous 5, 13 & 26 weeks
- Features based on the frequency,
 recency and monetary value
- Features based on the rate of change of behavior over time
- Customer Demographics



Training Gini
Out of Time Gini

32.2%

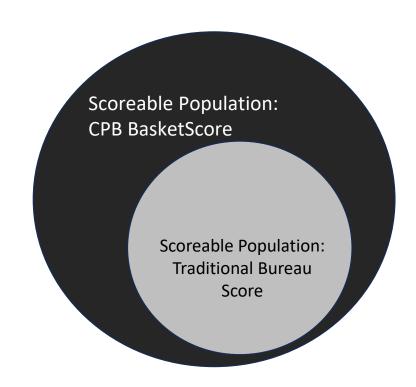
31.9%



Model Use Case

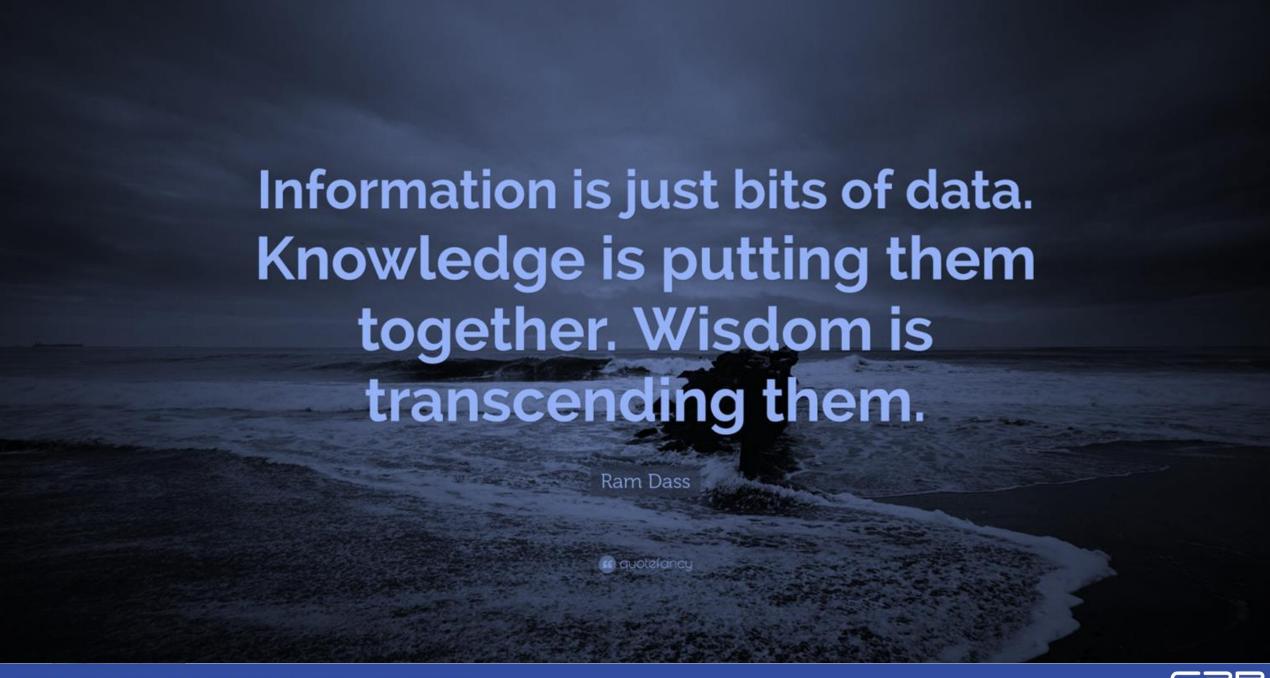
Live Credit Decisioning

- Client receives a credit score at time of consumer loan application via API
- Can be used to approve a consumer for a product they would be declined for if decisioning is based only on credit bureau data
- Can be used to lower pricing on products for lower risk customers
- Score cut-offs can be aligned to a client's existing cut-offs based on PD



Scores are available for all adult South Africans with a valid ID number, DO NOT HAVE TO BE CREDIT ACTIVE







Questions







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