



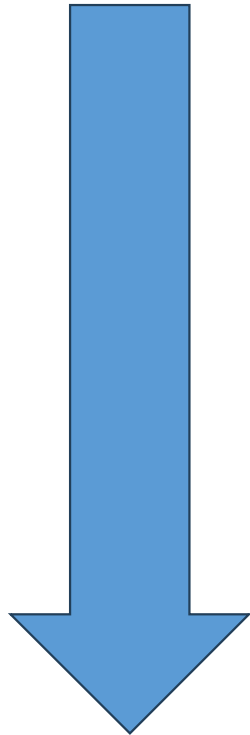
College of Liberal Arts & Sciences
Department of Statistics

Optimizing IVR: Machine Learning for Smarter Voice Interactions

Team members:

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Main Topics



1. EDA & Pattern Discovery

2. ML – Understand `resolve`

3. ML – Understand `reason`

4. Suggestions & ROI Analysis

Before EDA - Feature Engineering (1/2)

We have 2 snapshot time ->

March 13

March 18

Concerns: multicollinearity ($\text{corr} > 0.99$), similar distribution

Our solution

March 13

Keep this to explore account information

March 18 – March 13

Get the dynamic change

- Plus, we add `length_of_mos` -> represent customers who struggling with the IVR menu

Before EDA - Feature Engineering (2/2)

serial	mos
1	IA PP TR

One-hot Encode

Capture the mos code frequencies

serial	IA	PP	TR
1	1	1	1

Bigram

Capture mos code relations

serial	IA PP	PP TR
1	1	1

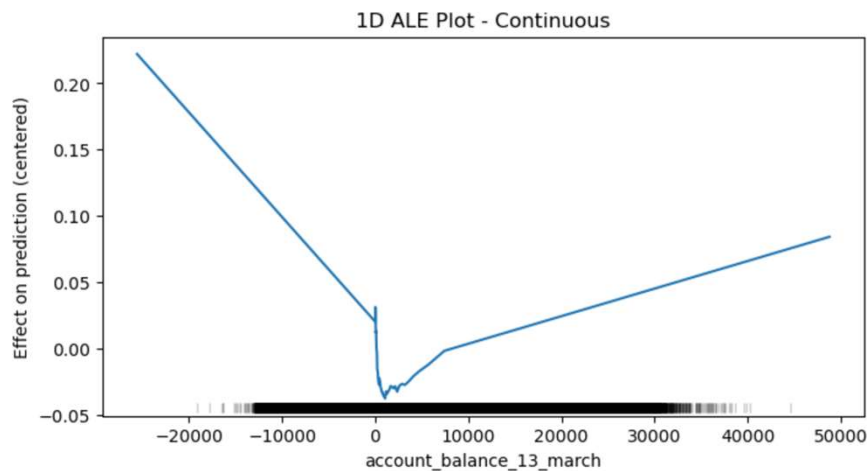


192 additional new binary features

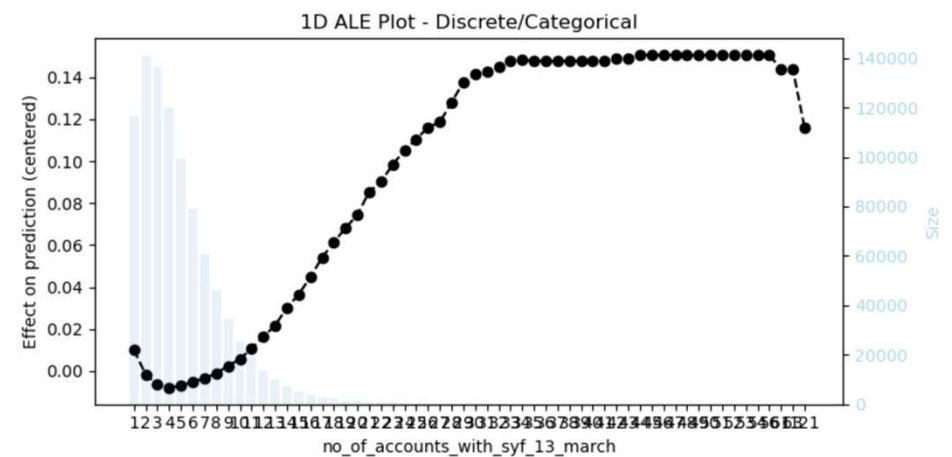
EDA – why linear models are not trustworthy

ALE (Accumulated Local Effects) plot

- SOTA machine learning interpretation method.
- It is unbiased - more robust to multicollinearity compared to PD plot.
- You can read the relative effect of changing the feature on the prediction.



Non-linear relationship

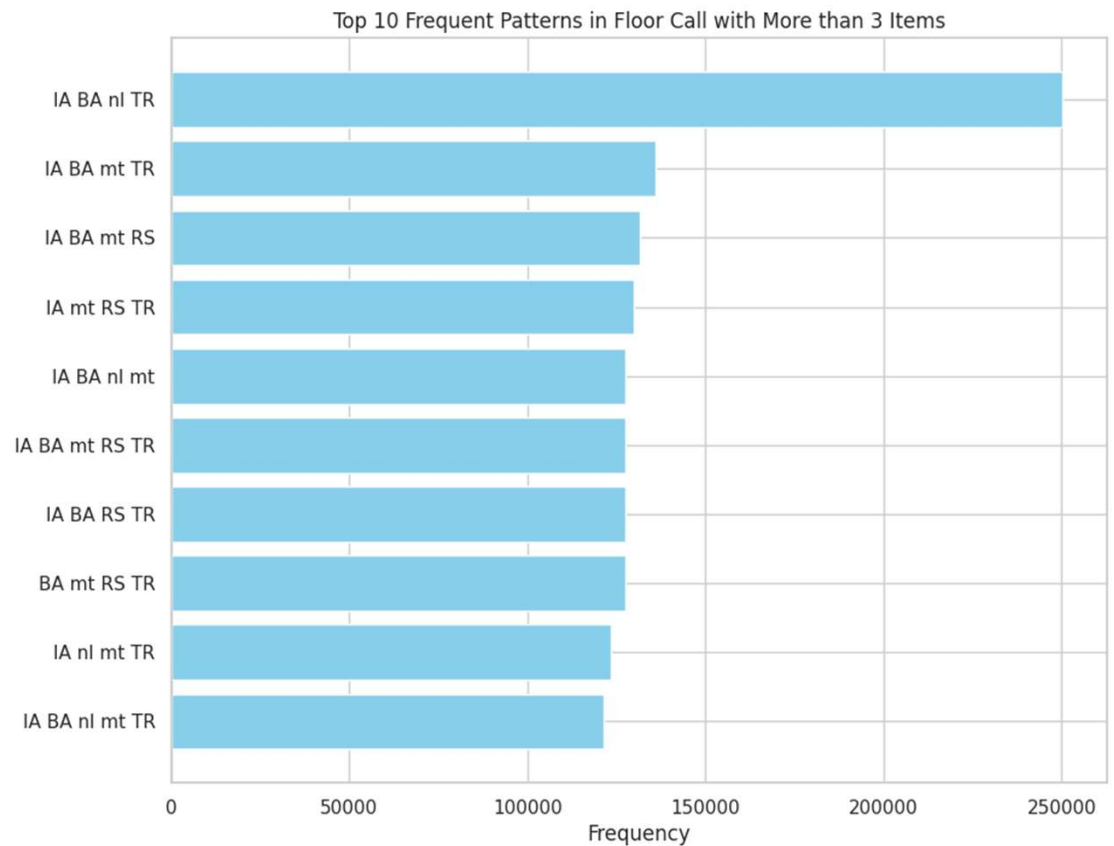


linear relationship

EDA - Association Mining Rule

MOS path:

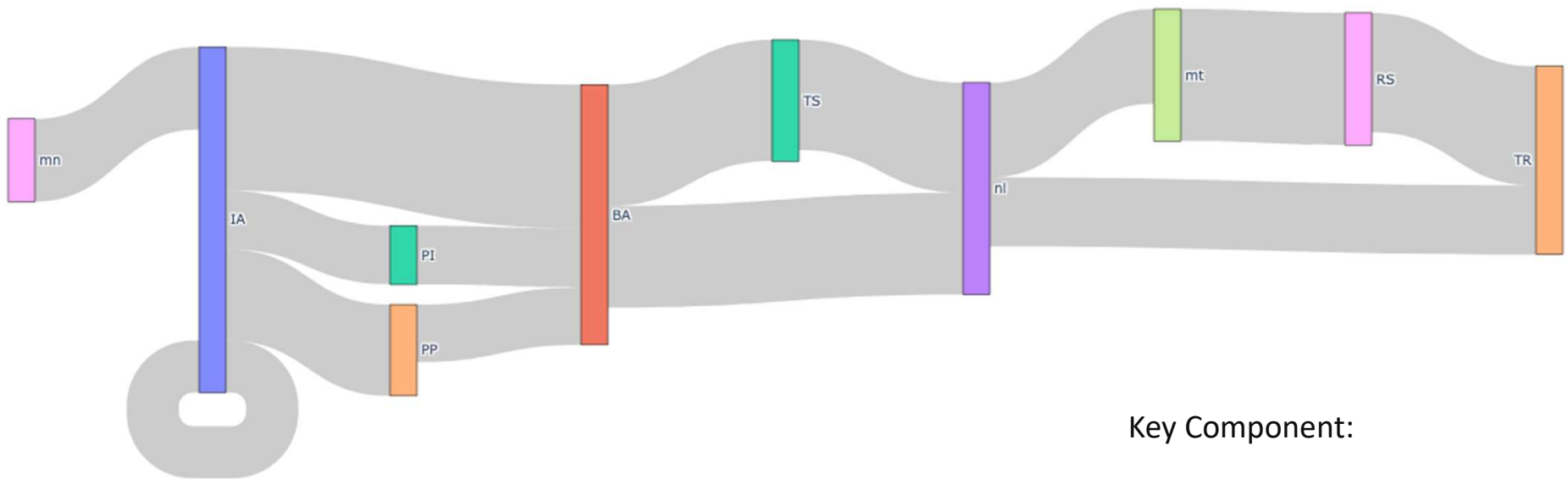
- **Length & Items**
- **Hard to Feature Engineering**



Pattern Discovery - Association Mining Rule

- Sankey Diagram (1/2)

Sankey Diagram of Item Transitions (Floor call)



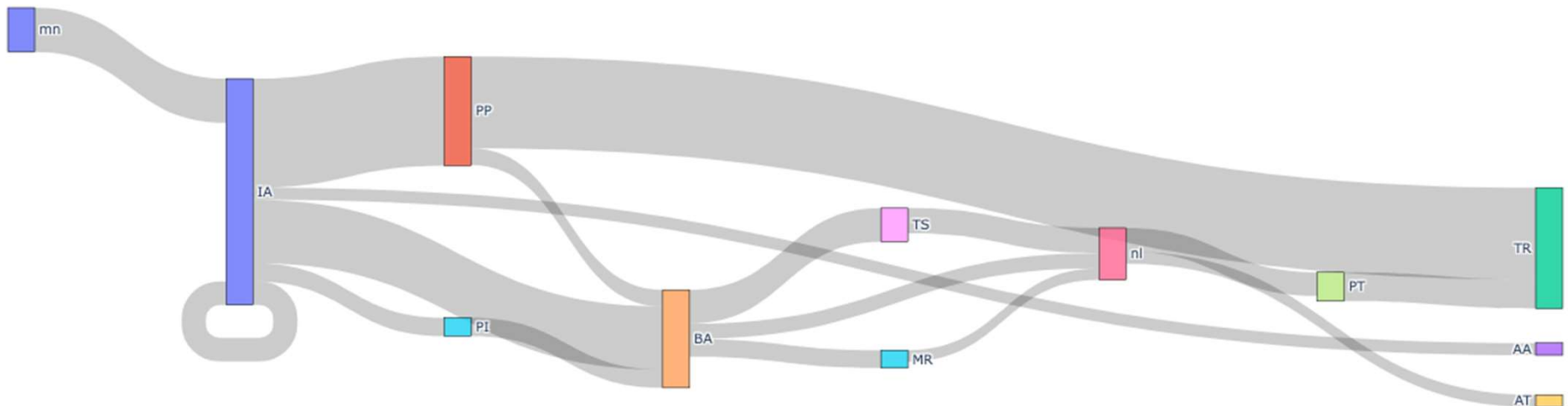
Key Component:

1. NLU Menu (nl)
2. Proactive Income (PI)
3. Pre-Transfer Menu (mt)
4. Global Router (RS)

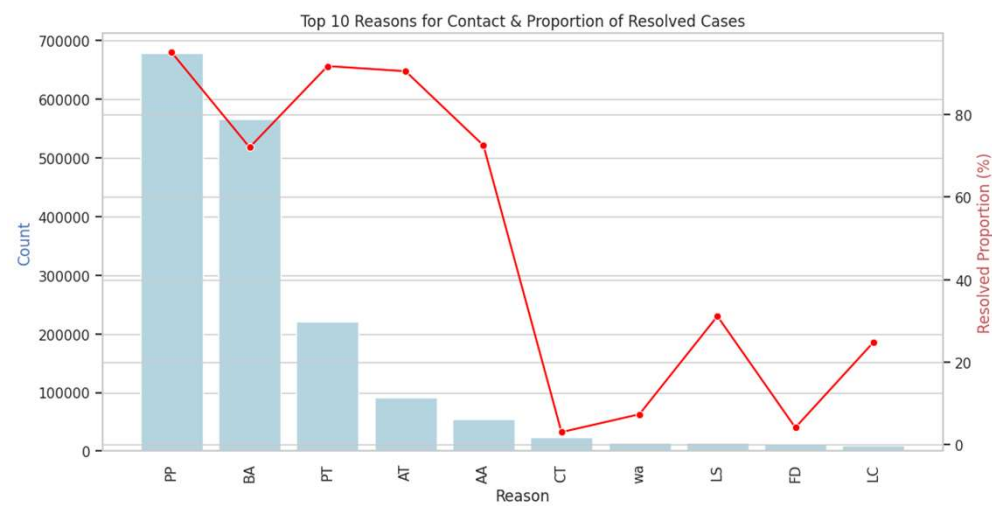
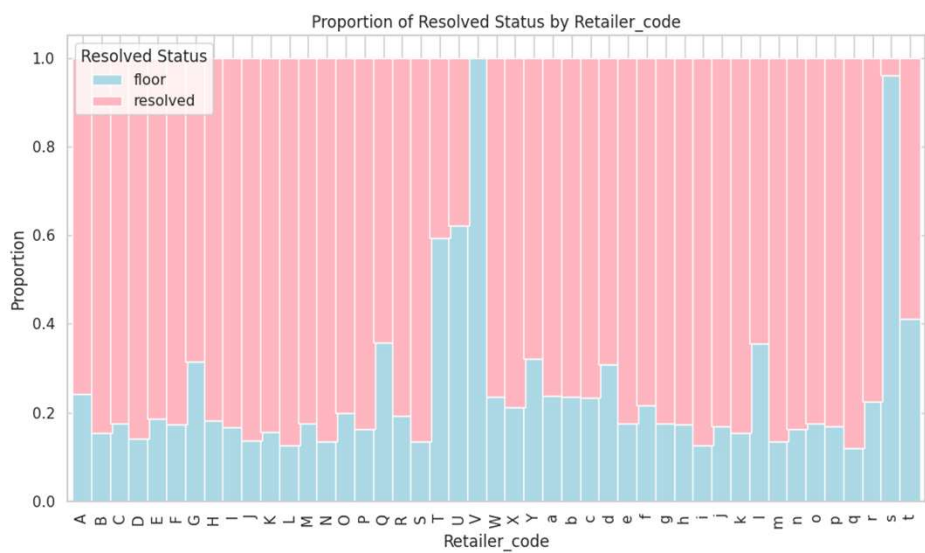
Pattern Discovery - Association Mining Rule

- Sankey Diagram (2/2)

Sankey Diagram of Item Transitions(Resolved call)

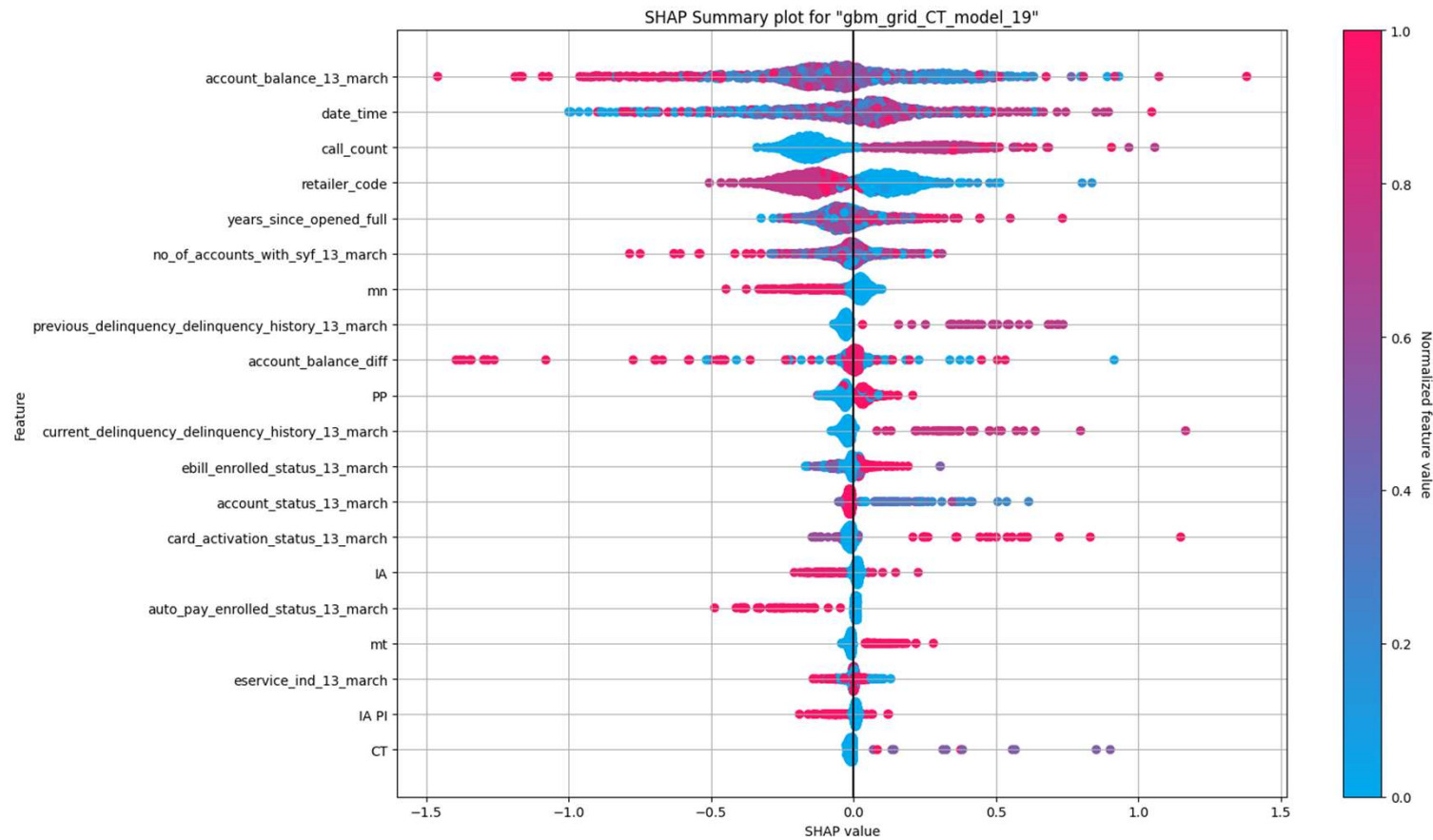


Pattern Discovery – retailer_code & reason



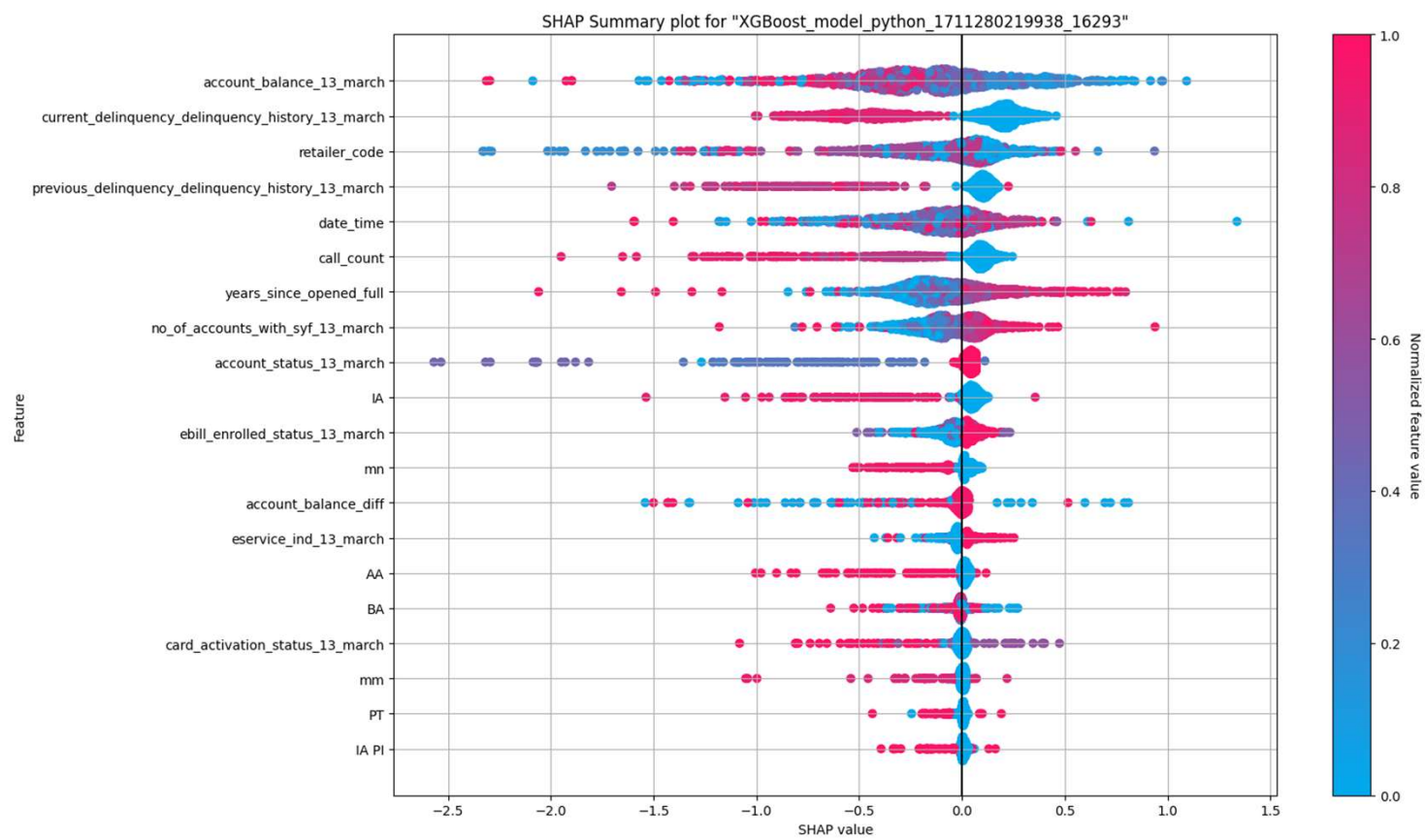
ML – on `resolved` (1/2)

Test Statistics	Value
f1	0.635
accuracy	0.890
precision	0.795



ML – on `resolved` (2/2)

Test Statistics	Value
f1	0.582
accuracy	0.898
precision	0.797



ROI Analysis – an example

Customer Service:

\$25 per hour

Average Time:

3 mins and 26 sec

Cost per call:

\$1.5

- Given that 1% improvement saves 200,000 agent/floor calls per month, that is, \$300,000.
- Then we can conclude, if you use \$300,000 gift cards to increase the number of users joining the “e-service” for example, and increase the success rate by 1%, then the investment is worthwhile.