Team #2

Credit Card Customer Segmentation Research



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Data Source



Business Understanding

- Define marketing strategy.
- Last 6 months timeline
- The Dataset -> behavior of 8500 active credit cardholders during the.
- 18 behavioral variables.
- Segmentation -> integral part of marketing objectives and strategies.
- **Identification** of new segments as targets for existing products or the development of new products is critical for companies with limited resources.

Cleaning and pre-processing the Data

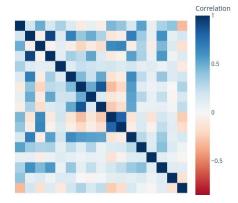
- Dropped:
 - rows with missing min payments values
 - rows with missing credit_limit values
 - column of customer_id (categorical)
- Before Scaling

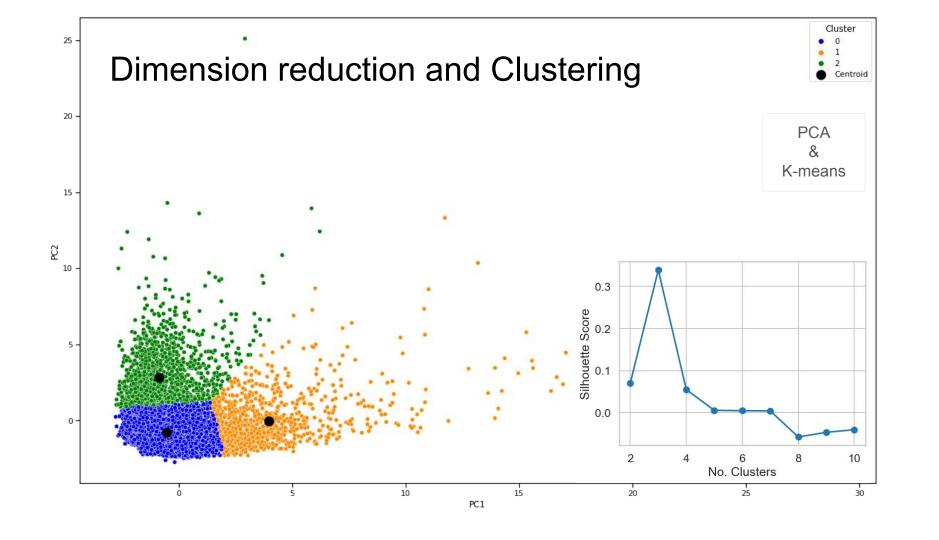
balance	purchases	paid	full
account	amount	advance	purchases
9.30	107.60	0.00	0.00
52.67	150.30	0.00	0.00
1,360.80	0.00	462.86	0.00

After Standard Scaler $(z = (x - \mu) / s)$

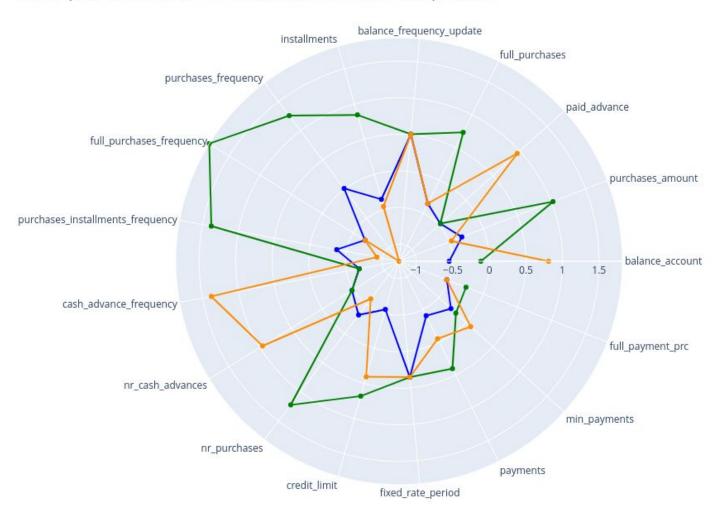
purchases	paid	full
amount	advance	purchases
-0.42	-0.47	-0.35
-0.40	-0.47	-0.35
-0.47	-0.25	-0.35
	amount -0.42 -0.40	amount advance -0.42 -0.47 -0.40 -0.47

- Correlation Matrix between features:





Radar plot, overview of the data (Feature median comparison)



Clusters:

- Strugglers (67.63%)
- --- Frequent_Spenders (13.35%)
- --- Convenience_Lovers (19.02%)

Who are them?

Strugglers



Convenience Lovers



Frequent Spenders



Description of the Consumer Segment

- Class 2 (highest purchases): Prosperous, frequent Spenders
 - use credit card for most of their daily transactions.
 - highest credit limit, highest payments + full payment pct
 - rational and responsible (using installments to manage large purchases)
- Class 1 (highest cash in advance): Convenience Lovers
 - hardly do any purchases or installments
 - use their card mainly for the cash in advance option
 - high credit limit paired with by far the largest balance account.
 - picture a tourist using his card only on vacation abroad

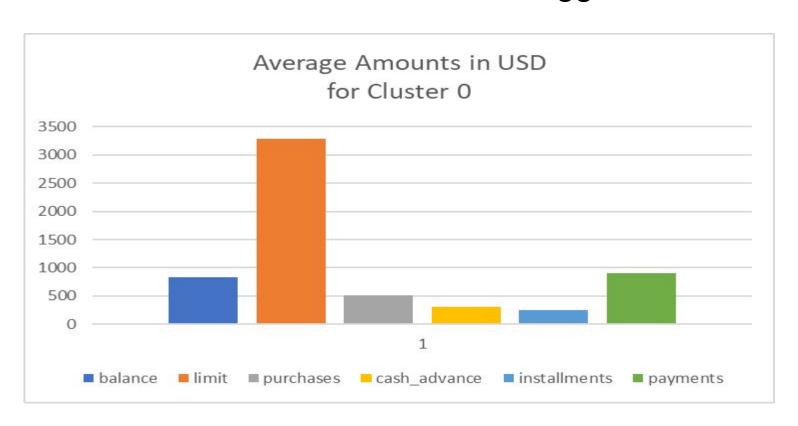
Description of the Consumer Segment

- Class 0 (lowest account balance): Strugglers
 - lowest credit limit paired with lowest balance, payments, full payment pct
 - regularly use their credit card for purchases, but can not afford much
 - Not efficiently managing their debt. Rarely use installments.

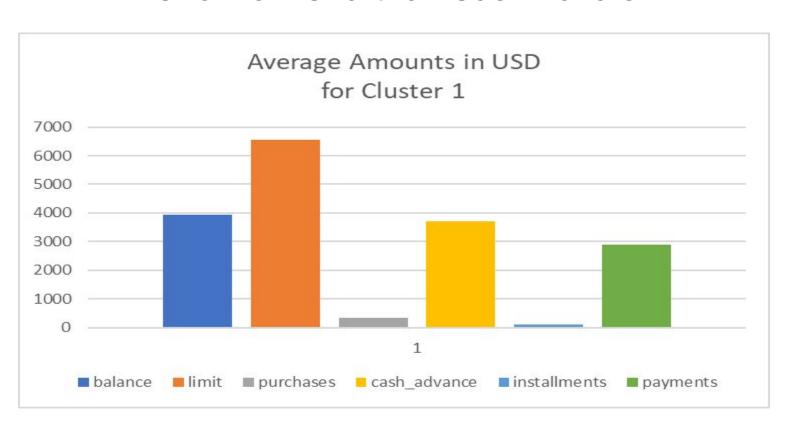
Distribution of Customers among the Segments

Prosperous: 1117
Convenient: 1591
Subprime: 5791

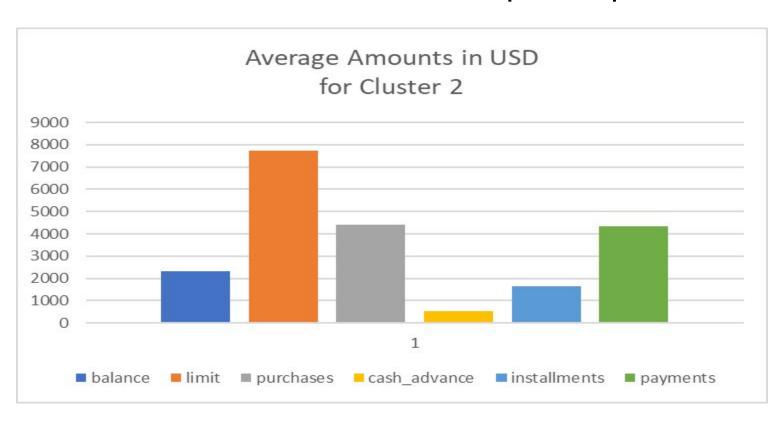
Overview Chart for the 'Strugglers'



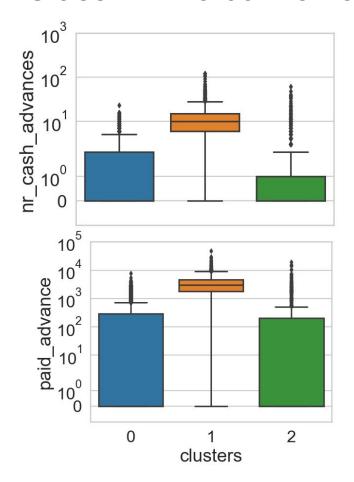
Overview Chart for 'Cash Lovers'



Overview Chart for the 'Frequent Spenders'



Class 1: The convenience lovers

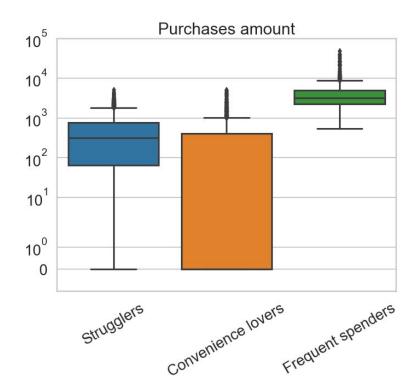


Number of cash advances: cash in advance given by the user

Paid in advance: number of transactions made with "Cash in Advance" method

Class 2: The frequent spenders

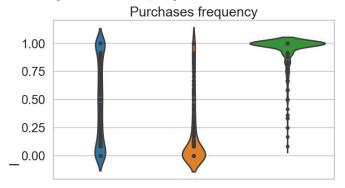
Purchase amount: amount of purchases made from client's account

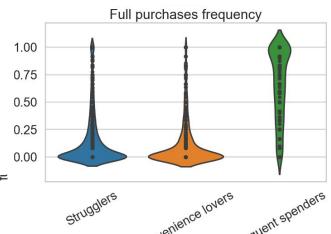


Clients in the 'Frequent spenders' class make much more purchases than clients in the other 2 classes

	Cluster 0	Cluster 1	Cluster 2
min	0	0	534.26
max	5,080.85	5,197.22	49,039.57
median	319.98	0	3,220.09

'Frequent spenders' frequently buy and often pay in full amount, while 'strugglers are rarely able to pay back in full





Purchases frequency: how frequently the purchases are being made

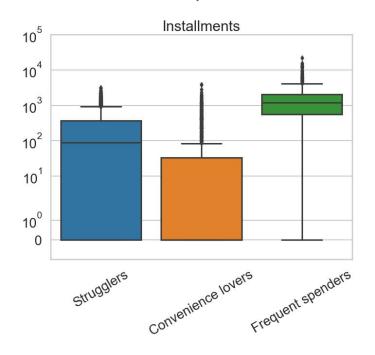
Full purchases frequency: how frequently purchases are happening in <u>full payment</u>

Both scores between 0 and 1:

- 0 = not frequently purchased
- 1 = frequently purchased

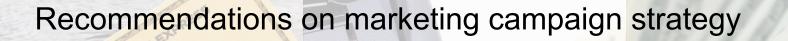
'Frequent spenders' prefer payments in installments

Installments: amount of purchases done in installments



Frequent spenders class:

- Financially comfortable
- High credit limit



Target "Struggles" with more installments (less expensive than credit)

Target "Convenience lovers" with cash in advance product

Target "Frequent spenders" with premium, luxury products, payback