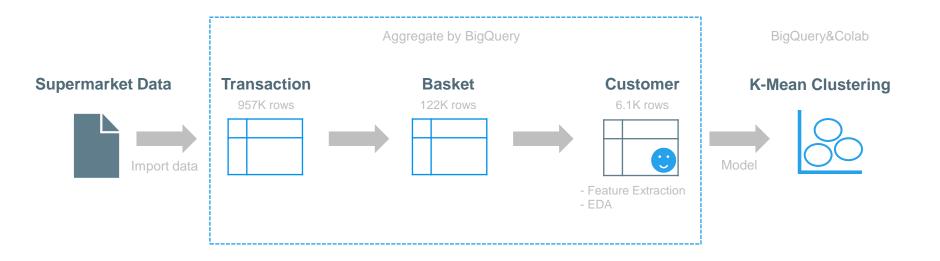


BADS7105 CRM Analytics and Intelligence Korrapin Pimapansri

### **Process Flow**



## Feature Extraction

### Customer

6.1K rows

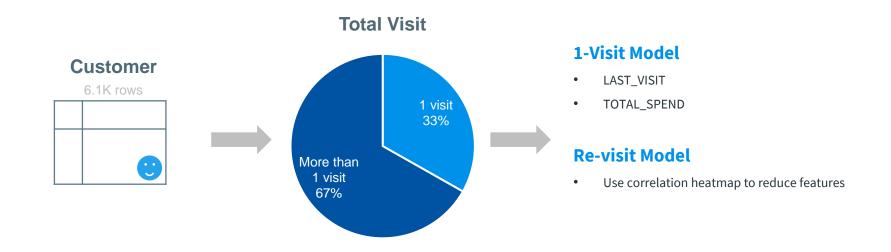




4 groups 30 features

Group	Feature	Description
	TOTAL_VISIT	Total visit
	TOTAL_SPEND	Total spending
RFM	AVG_VISIT_PER_MONTH	Average visit per month
KLIN	AVG_SPEND	Average spending per time
	LAST_VISIT	No of month between last visit and today
	AGE	No of month between first visit and last visit
	PROB_WEEKEND	
	PROB_WEEKDAY	
Daytime	PROB_MORNING	Probability to visit on daytime
	PROB_AFTERNOON	
	PROB_EVENING	
	PROB_BAS_L	Probability of basket size
	PROB_BAS_M	(L=Large, M=Medium, S=Small)
	PROB_BAS_S	(L-Large, W-Wedidiff, S-Siffall)
	PROB_BAS_PRICE_LA	Probability of basket price sensitivity
Purchased	PROB_BAS_PRICE_MM	(LA=Less Affluent, MM=Mid Market,
behavior	PROB_BAS_PRICE_UM	UM=Up Market)
	PROB_BAS_DOMI_FRESH	
	PROB_BAS_DOMI_GROCERY	Probability of shopping dominant mission
	PROB_BAS_DOMI_MIXED	
	PROB_BAS_DOMI_NONFOOD	
	CUS_PRICE_LA	
	CUS_PRICE_MM	Customer's Price Sensitivity
	CUS_PRICE_UM	
Customer	CUS_LIFE_OA	
behavior	CUS_LIFE_OF	Customer's Lifestage
Solidviol	CUS_LIFE_OT	(OA=Oder Adults, OF=Older Families,
	CUS_LIFE_PE	OT=Other, PE=Pensioners,
	CUS_LIFE_YA	YA=Young Adults, YF=Young Families)
	CUS_LIFE_YF	

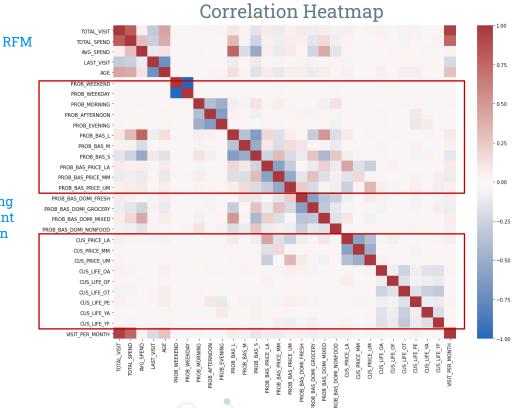
### **EDA**



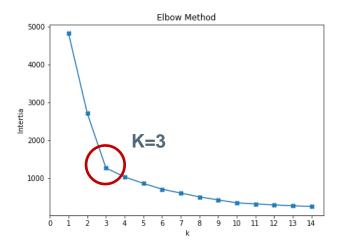
### EDA: Re-visit Model

Remove low correlation
 & duplicate feature

Shopping Dominant mission



## K-Mean Clustering: 1-visit Model



### Metrics

Davies-Bouldin index	0.7666
Mean squared distance	0.6246

### Numeric features

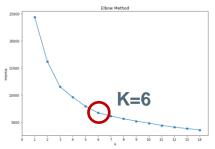
This table shows the centroid value for each feature. Use the select menu to view more numeric features.

Selected Features		
LAST_VISIT, TOTA	L_SPEND	•

Centroid Id	Count	LAST_VISIT		TOTAL_SPEND	
1	924	************	21.7316	•	5.2865
2	961		9.2664	•	4.9601
3	140		15.0571		52.2992

## K-Mean Clustering: Re-visit Model

**RFM** 



#### Numeric features

This table shows the centroid value for each feature. Use the select menu to view more numeric features.

Selected Features

AGE, AVG. SPEND, AVG. VISIT\_PER\_MONTH, LAST\_VISIT, TOTAL\_SPEND, TOT

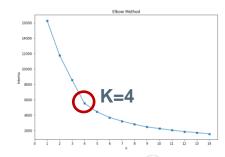
AGE, AVG_SPEND,	AVG_VISIT_PER	_MONTH, LAST_VI	ISIT, TOTAL_SPI	END, TOTAL ▼	

etr	

Davies-Bouldin index 1.104
Mean squared distance 1.664

Centroid Id	Count	AGE		AVG_SPEND		AVG_VISIT_PER_MO	NTH	LAST_VISIT		TOTAL_SPEND		TOTAL_VISIT	
1	1,000	•	8.3410	•	6.8203	•	0.7255	•••	5.0820		35.9488	•	4.8160
2	454		25.2643	•	14.3659	•	4.1302	•	0.5242		1,350.5752		102.326
3	136		26.4265	••••	13.3368		10.6244		0.1471		3,350.1233		280.066
4	588	•	4.0476	•	7.9384	•	0.8807	***********	17.6480		26.5430		3.1207
5	1,577		22.0450	•	7.8951	•	0.6879	•	1.8269	•	131.8390	•	15.7077
6	320		18.0031	**********	38.7650	•	0.7522	•	2.9156	•	486.3008	•	13.0818

Shopping Dominant Mission



#### Numeric features

This table shows the centroid value for each feature. Use the select menu to view more numeric features.

#### Selected Features -

 ${\tt PROB\_BAS\_DOMI\_FRESH, PROB\_BAS\_DOMI\_GROCERY, PROB\_BAS\_DOMI\_MIXE...} \ \ \blacksquare$ 

#### Metrics

Davies-Bouldin index 0.9227 Mean squared distance 1.3592

Centroid Id	Count	PROB_BAS_DOMI_FRESH	PROB_BAS_DOMI_GROCERY	PROB_BAS_DOMI_MIXED	PROB_BAS_DOMI_NONFOOD
1	839	0.1964	0.7046	0.0550	0.0291
2	1,098	0.2990	0.1475	0.5079	0.0356
3	285	0.1961	0.1321	0.0885	0.5723
4	1,853	0.7152	0.1086	0.1212	0.0360

## Interpreting Result : 1-visit Model

High spending
Visitors

131 of customers (2.1% of base)

3<sup>rd</sup> lowest total revenue
0.5% revenue contribution
High Recency
Highest spending per time

Special campaign by occasion

966 of customers (15.8% of base)

Lowest total revenue
0.3% revenue contribution

Visitors

High Recency
Low spending per time

Special campaign by occasion

928 of customers (15.2% of base)

Lowest total revenue
0.3% revenue contribution

Let them go

Highest Recency (Last visit 2 years ago)

Low spending per time

# Interpreting Result : Re-visit Model

ه ۸ ه	107 of customers (1.7% of base)	Average spending per time		309 of customers (5.1% of	base) High spending per time		
Champion	2 <sup>nd</sup> highest total revenue 25% revenue contribution	Lowest Recency Avg visit 3 times per week Risk		3% revenue contribution	Last visit 6 months ago Avg visit 1 times per month		
	More than 2 years relationship	Basket dominant mission 67% Fresh 26% Mixed		Less than 1 year relationsh	Basket dominant mission 33% Fresh 55% Mixed		
	Maintain, Offer VIP privilege to	maintain frequency		Remind to visit, Offer	promotion with short period expired		
	418 of customers (6.9% of base)	Average spending per time		1,859 of customers (30.5%	of base) Low spending per time		
Loyalist	Highest total revenue 43% revenue contribution	Lowest Recency Avg visit 1 times per week	Econom	9% revenue contribution	Low Recency Avg visit 1 times per month		
	More than 2 years relationship	Basket dominant mission 63% Fresh 32% Mixed	Shoppe	1.5 years relationship	Basket dominant mission 51% Fresh 25% Grocery		
	Drive to Champion, Offer promo	otion to upsell or drive frequency		Offer promotion for incr	Offer promotion for increase upsell/frequency		
	500 ( ) (0.70( () )	in in the second		853 of customers (14.0% of	of base) Low spending per time		
	532 of customers (8.7% of base)	High spending per time		·	, , , , , , , , , , , , , , , , , , , ,		
Once a	3 <sup>rd</sup> highest total revenue 18% revenue contribution	Low Recency Avg visit 1 times per month	Need	1% revenue contribution	High Recency Avg visit 1 times per month		
month	More than 2 years relationship	Basket dominant mission 41% Fresh 52% Mixed	Attentio	Less than 6 months relation	nship Basket dominant mission 33% Fresh 55% Mixed		
	Maintain, Remind to visit every	month		Offer promotion for inc	Offer promotion for increase upsell/ frequency		