

# GEOSPATIAL OPERATIONAL INSIGHTS FOR NATIONAL LIBRARY BOARD

APPLYING THE HUFF'S MODEL AND RFM ANALYSIS IN SHINY R

TEAM QUI VIVRA VERRA

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# PROJECT STAKEHOLDERS



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National Library Board Singapore

INTRODUCTION

LITERATURE REVIEW

METHODOLOGY

VISUALIZATIONS

IMPLICATIONS

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INTRODUCTION




LITERATURE REVIEW

METHODOLOGY

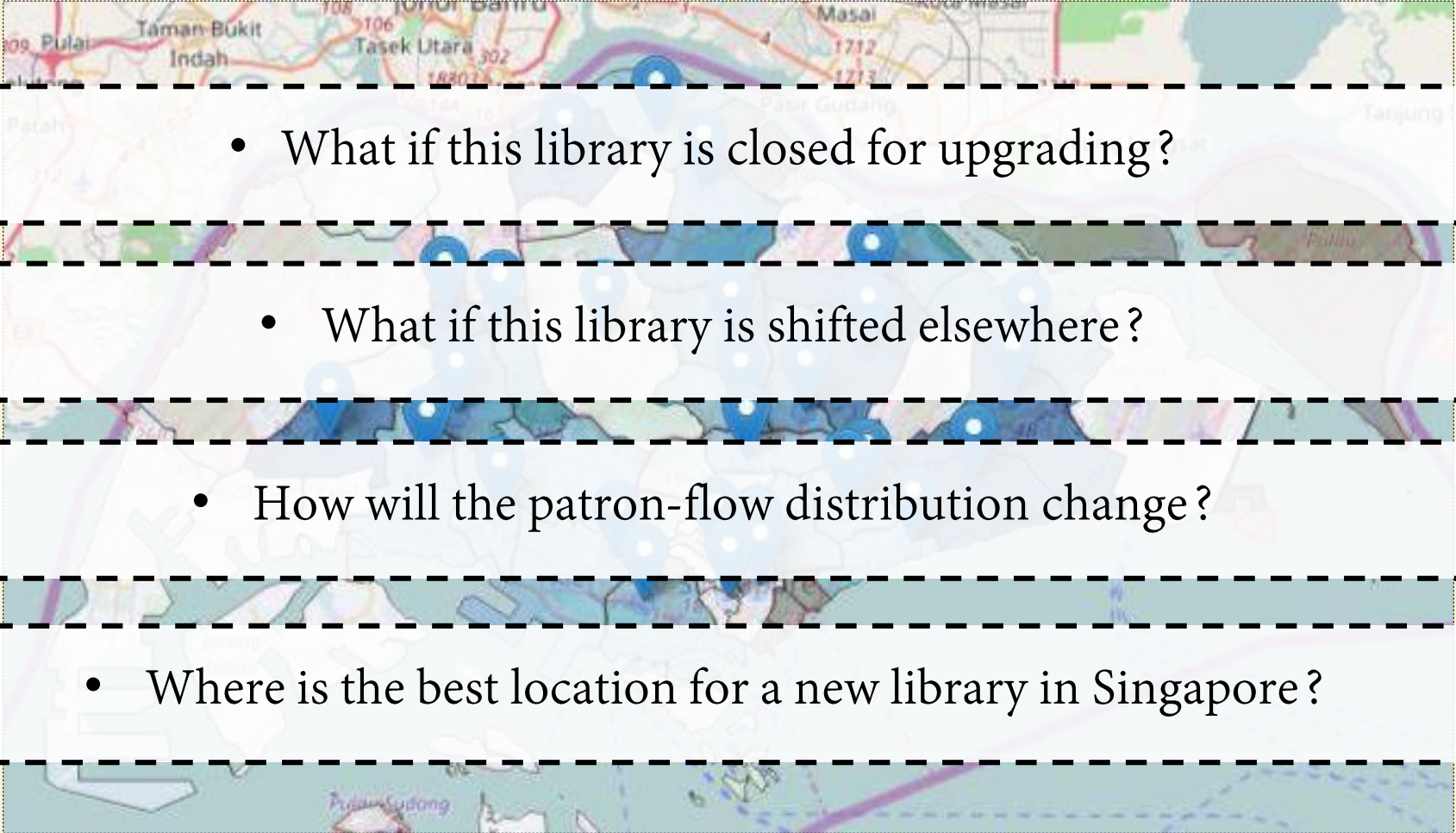
VISUALIZATIONS

IMPLICATIONS

# OVERVIEW

 <b>WHAT</b>	<ul style="list-style-type: none"><li>• Patron-flow distribution to libraries</li><li>• Different patrons' profiles</li></ul>
 <b>WHY</b>	<ul style="list-style-type: none"><li>• To implement future campaigns</li></ul>
 <b>HOW</b>	<ul style="list-style-type: none"><li>• Retail trade area analysis</li><li>• Customer segmentation</li></ul>

# INTRODUCTION

- 
- What if this library is closed for upgrading?
  - What if this library is shifted elsewhere?
  - How will the patron-flow distribution change?
  - Where is the best location for a new library in Singapore?

# MOTIVATION

- Campaigns and policies are to be supported by scientific methods



*Opening of library@orchard in 2014.*

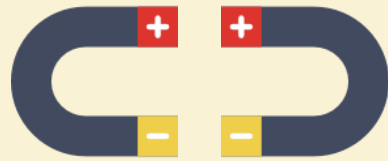


*NLB has experimented with many different library prototypes.*



*You can borrow popular movie titles from library@esplanade*

# LITERATURE REVIEW – HUFF'S MODEL

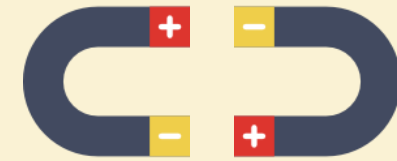


Push Factor

Distance Decay



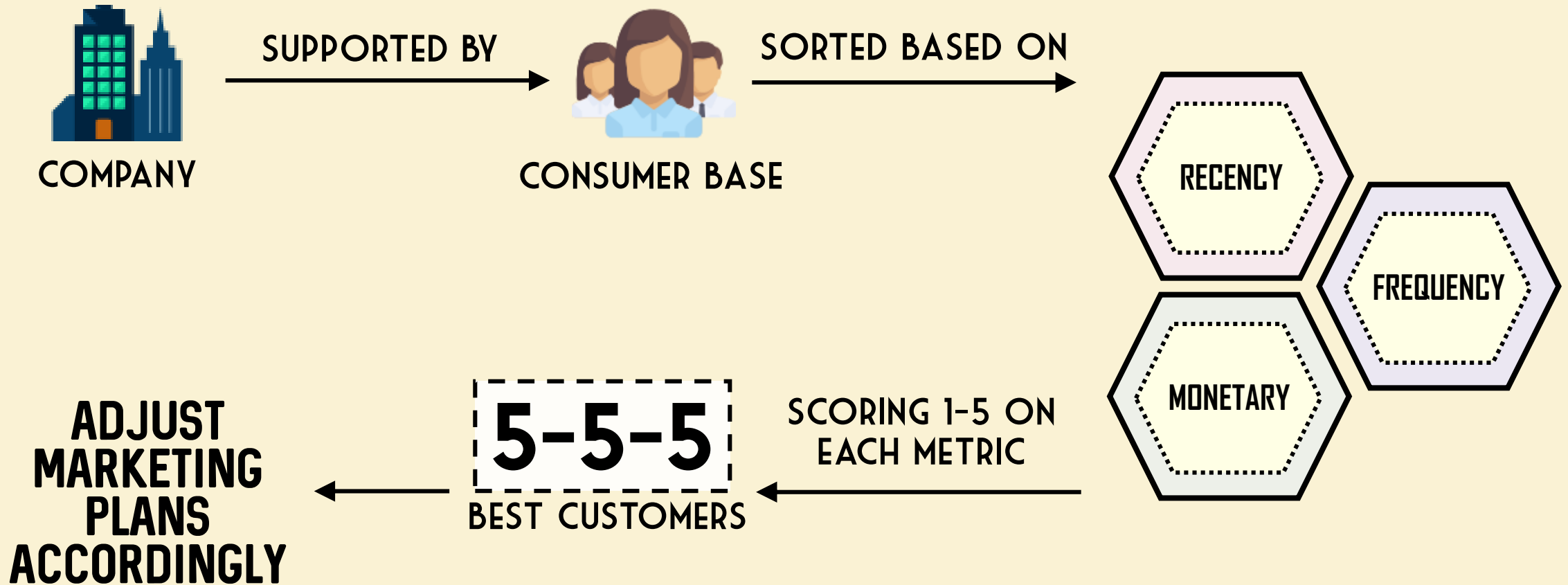
Gravity Model



Pull Factor

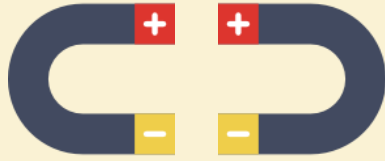
Destination Attractiveness

# LITERATURE REVIEW – RFM ANALYSIS





# METHODOLOGY – HUFF'S MODEL



Push Factor



Pull Factor

Distance Decay

Destination Attractiveness

OLS  
REGRESSION



CONTRIBUTION  
OF EACH FACTOR



Distance from subzone  
centroid to library



Collection size



No. of MRT stations in 1km



No. of tuition centres in 1km



No. of shopping malls in 1km

# METHODOLOGY – HUFF'S MODEL

Let the general form of the Huff's Model be:

$$P_{ij} = \frac{(\sum_{h=1}^H A_{hj}^{\alpha_h}) D_{ij}^{\beta}}{\sum_{j=1}^n (\sum_{h=1}^H A_{hj}^{\alpha_h}) D_{ij}^{\beta}}$$

$P_{ij}$  = probability of a patron residing at planning area  $i$  visiting library  $j$ .

$A_{hj}^{\alpha_h}$  = a measure of the  $h$ -th characteristic that reflects the attractiveness of library  $j$ .

$D_{ij}^{\beta}$  = distance from centroid of subzone  $i$  to library  $j$ .

$\alpha$  = a parameter for the sensitivity of  $P_{ij}$  associated with an attractiveness variable  $h$ .

$\beta$  = a parameter for the sensitivity of  $P_{ij}$  associated with the distance

$n$  = total number of libraries

# METHODOLOGY – HUFF'S MODEL

We start by taking the logarithm of the general form:

$$\log P_{ij} = \sum_{h=1}^H \alpha_h \log A_{hj} + \beta \log D_{ij} - \log \sum_{j=1}^n \left( \sum_{h=1}^H A_{hj}^{\alpha_h} \right) D_{ij}^{\beta}$$

Summing both sides over  $j (= 1, 2, \dots, n)$ , and dividing both sides by  $n$ , we have:

$$\frac{1}{n} \sum_{j=1}^n \log P_{ij} = \sum_{h=1}^H \alpha_h \left( \frac{1}{n} \sum_{j=1}^n \log A_{hj} \right) + \frac{\beta}{n} \sum_{j=1}^n \log D_{ij} - \log \sum_{j=1}^n \left( \sum_{h=1}^H A_{hj}^{\alpha_h} \right) D_{ij}^{\beta}$$

Let  $\bar{P}_{ij}$ ,  $\bar{A}_{hj}$ , and  $\bar{D}_{ij}$  be the respective geometric means for  $P_{ij}$ ,  $A_{hj}$ , and  $D_{ij}$ . We can write the equation as:

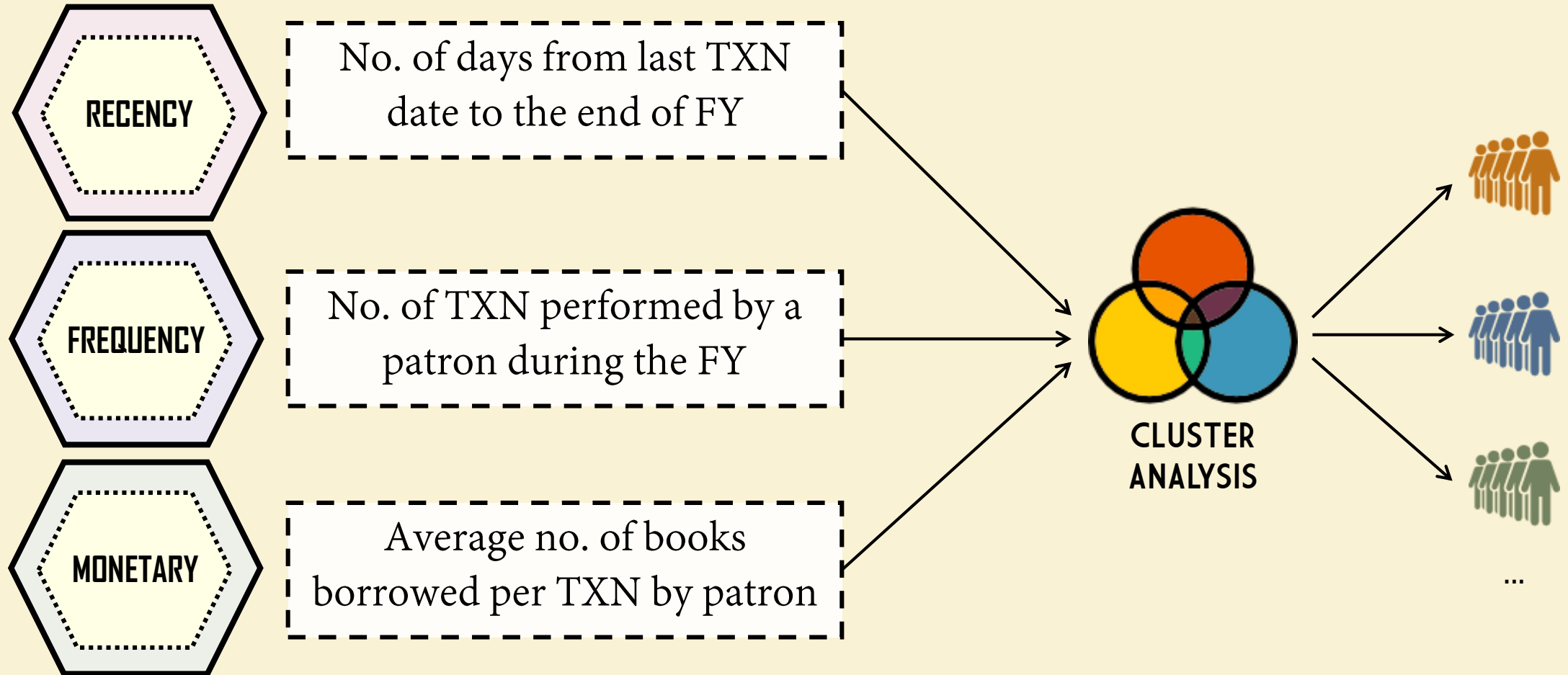
$$\log \left( \frac{P_{ij}}{\bar{P}_{ij}} \right) = \sum_{h=1}^H \alpha_h \log \left( \frac{A_{hj}}{\bar{A}_{hj}} \right) + \beta \log \left( \frac{D_{ij}}{\bar{D}_{ij}} \right)$$

# METHODOLOGY – HUFF'S MODEL

Therefore, we can estimate the probability of a patron residing at subzone  $j$  visiting library  $j$  using the equation, with the estimated parameters:

$$\widehat{P}_{ij} = \frac{(\sum_{h=1}^H A_{hj}^{\hat{\alpha}_h}) D_{ij}^{\hat{\beta}}}{\sum_{j=1}^n (\sum_{h=1}^H A_{hj}^{\hat{\alpha}_h}) D_{ij}^{\hat{\beta}}}$$

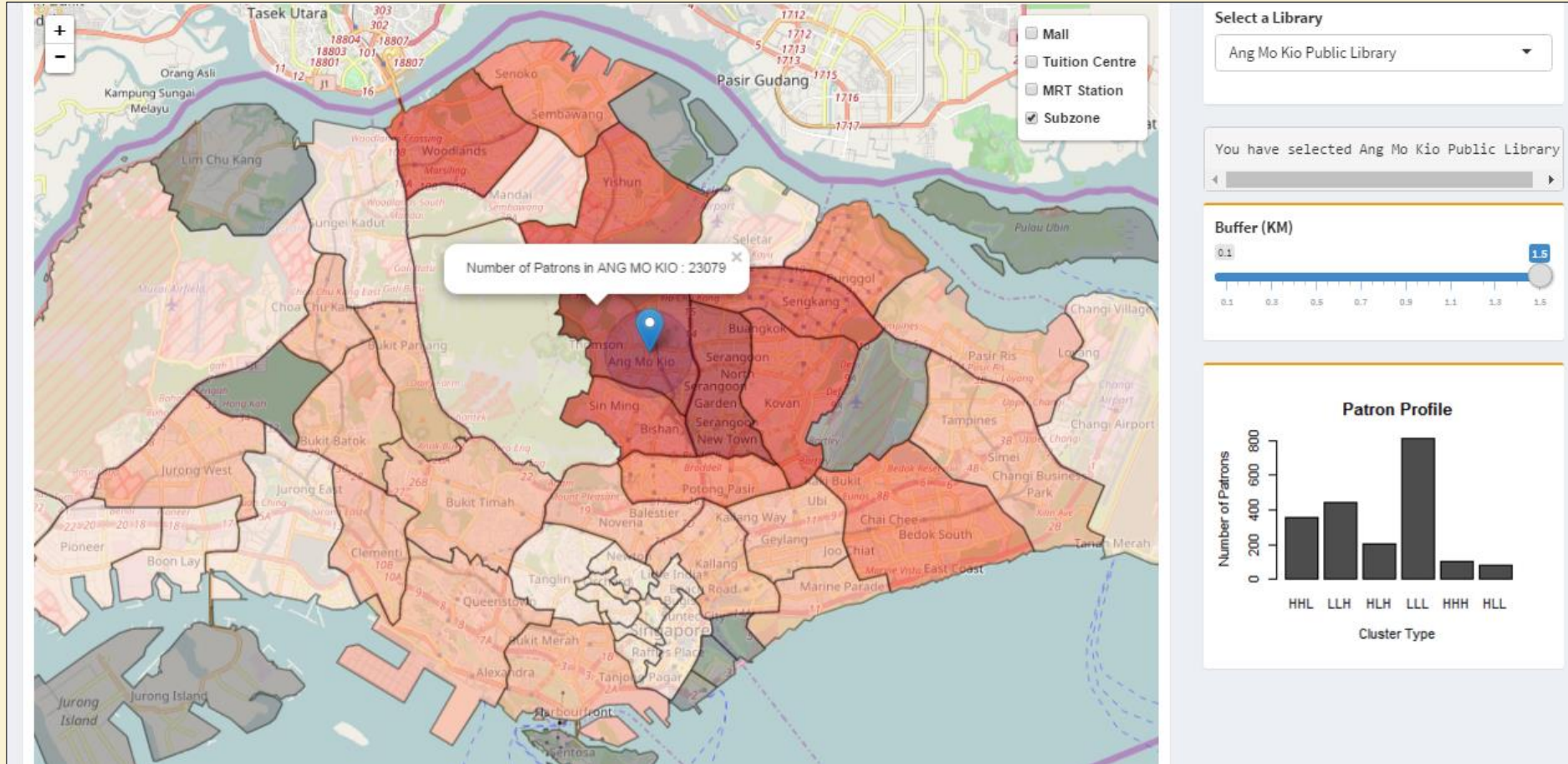
# METHODOLOGY – RFM ANALYSIS



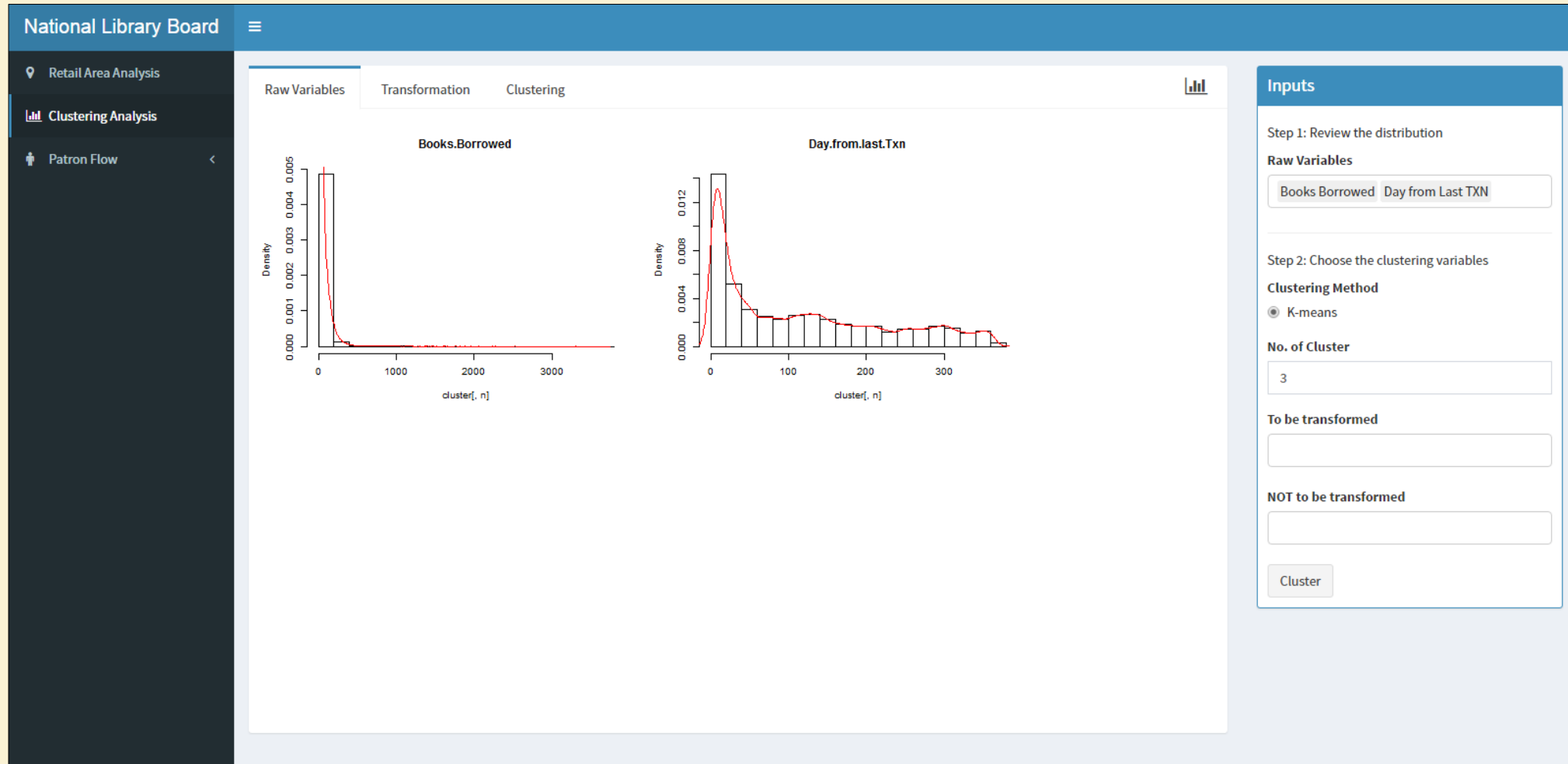
# ADJUSTABLE BUFFER FOR AMENITIES



# PATRON FLOW CHOROPLETH MAP

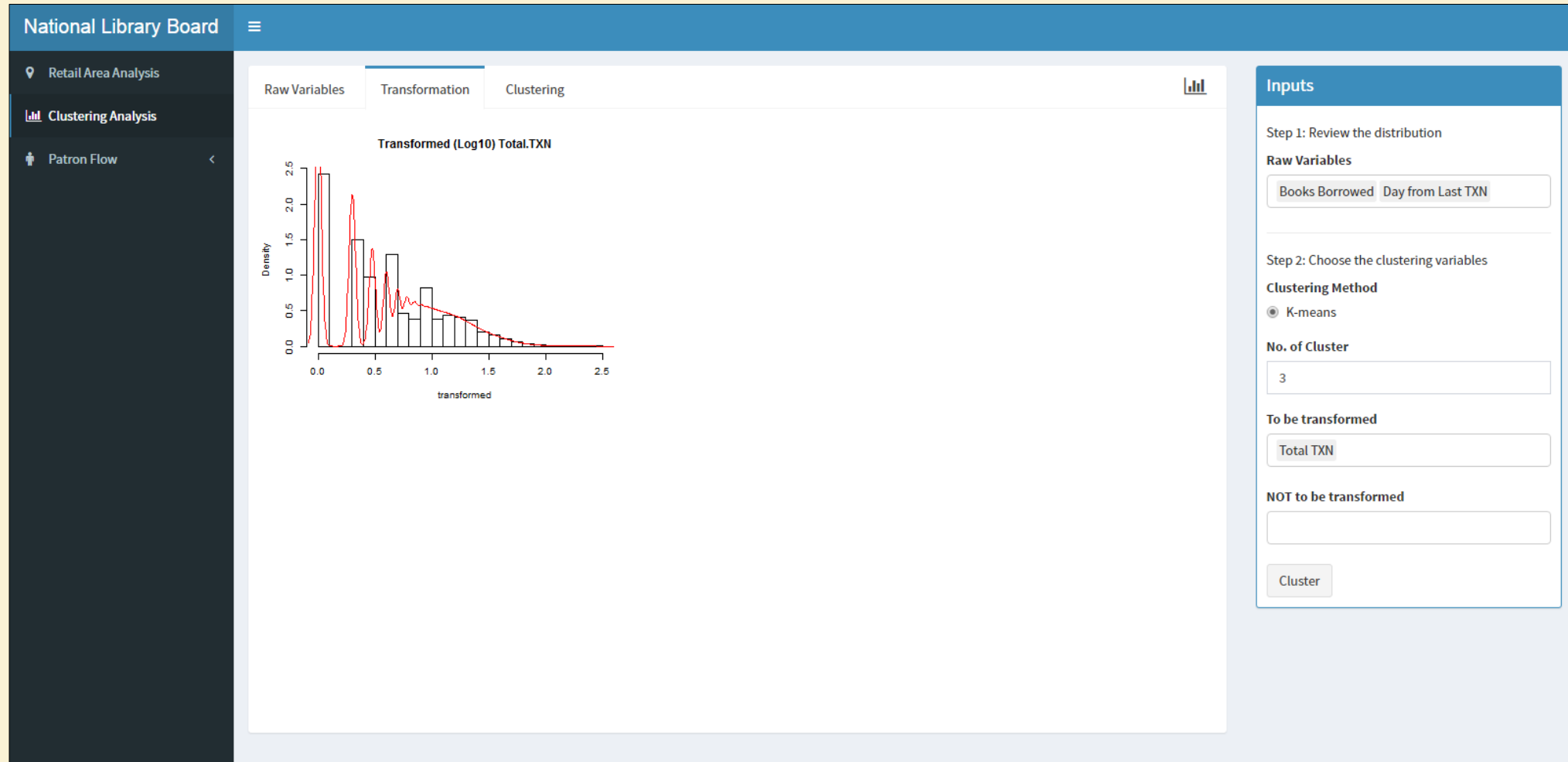


# RFM – REVIEW DISTRIBUTION

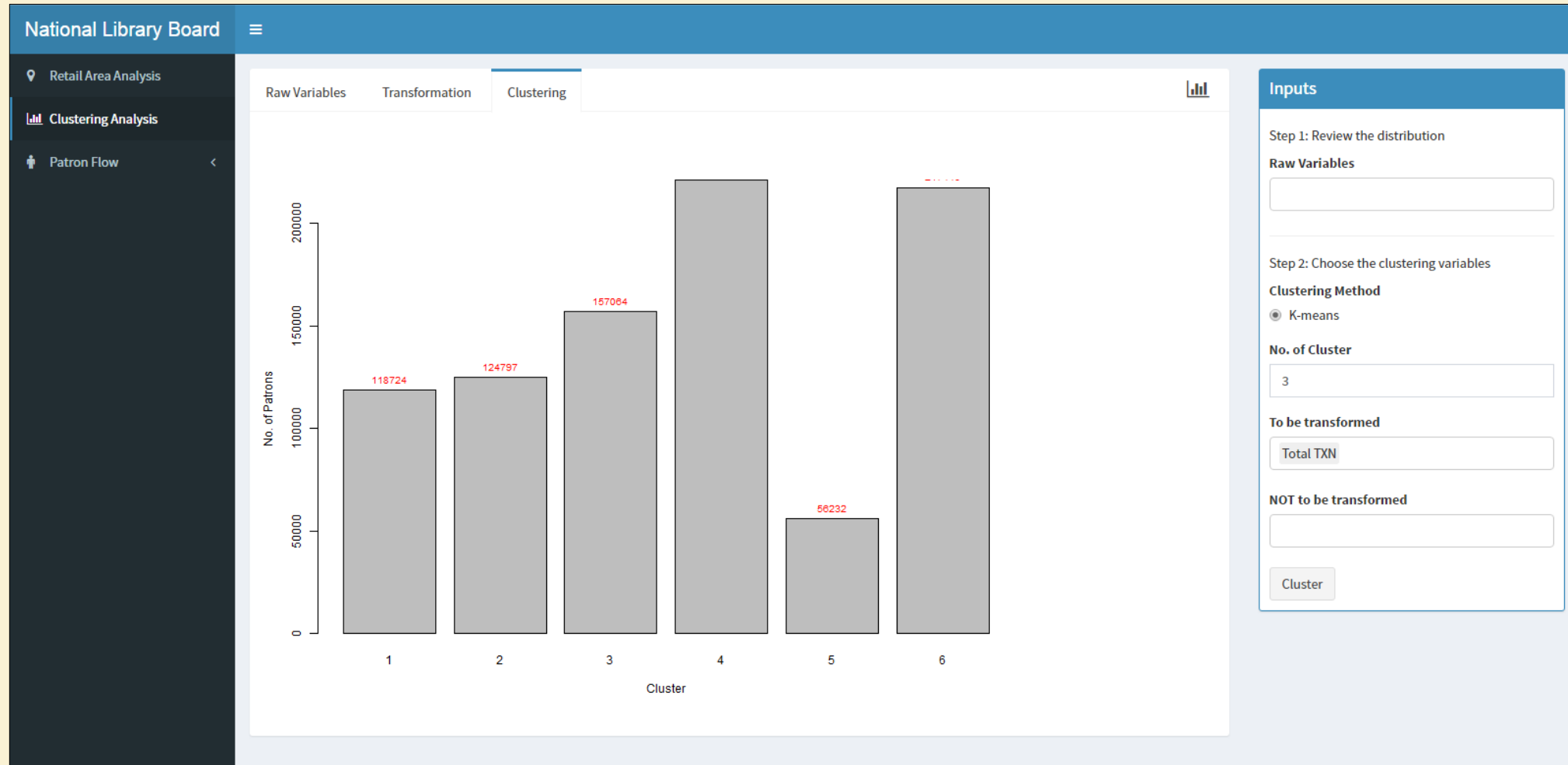




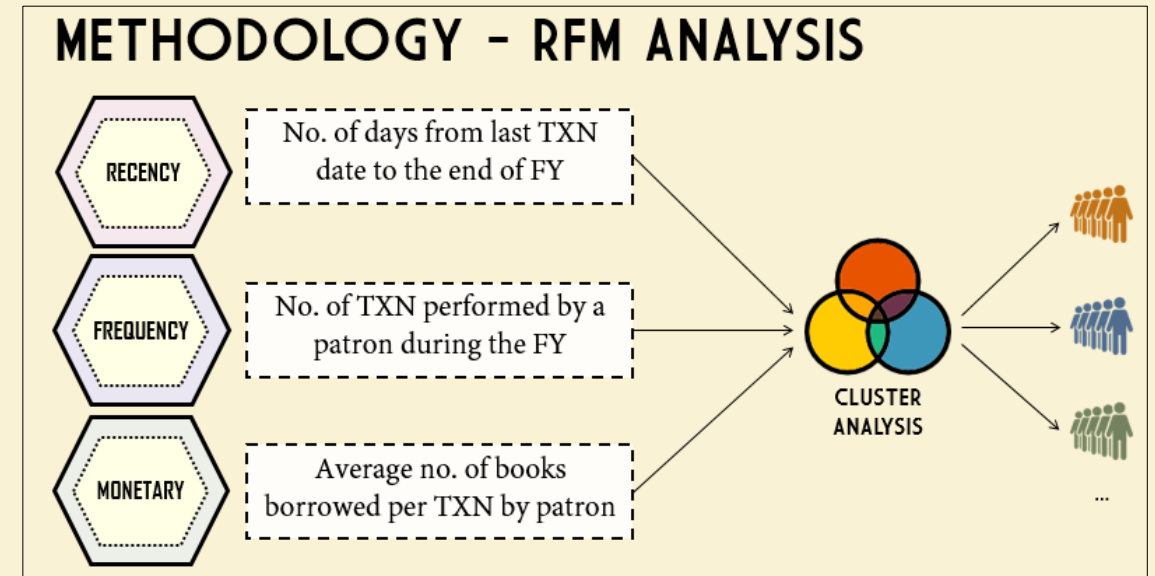
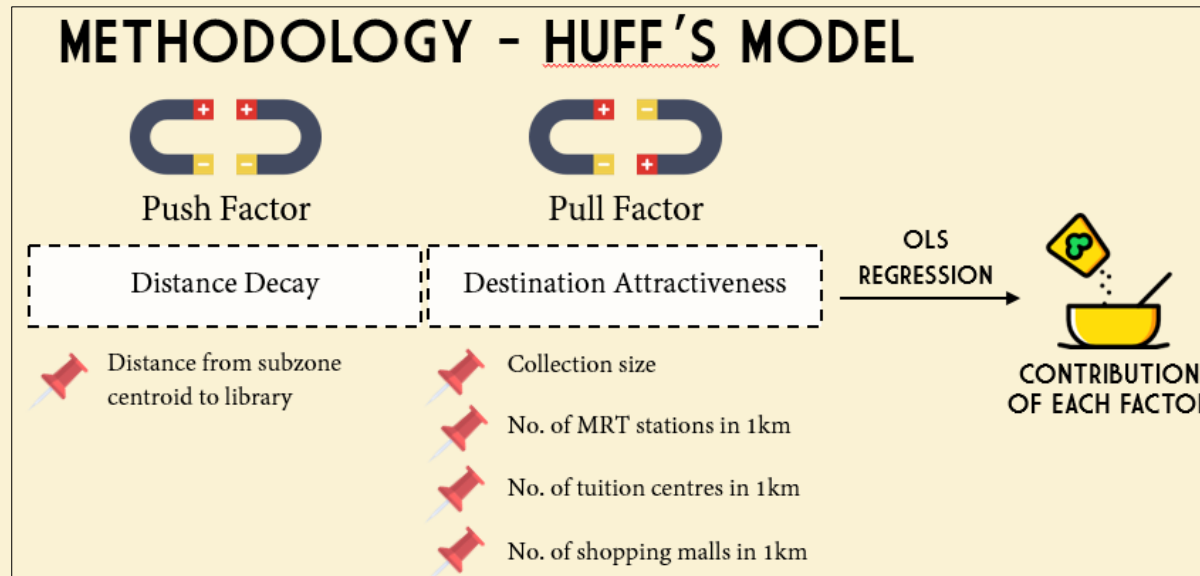
# RFM – TRANSFORM VARIABLE



# RFM – PATRON SEGMENTATION

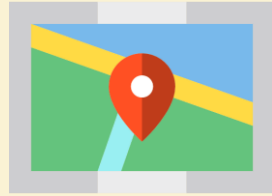


# IMPLICATIONS



Forward-planning in resource allocation for future campaigns and policies

# QUESTIONS



# ANSWERS