



INTEGRATION OF METRO WITH OTHER MODES OF TRANSPORT - CUSTOMER SATISFACTION: A CASE OF DELHI

Research Symposium – Urban Mobility India Conference
16th November 2019

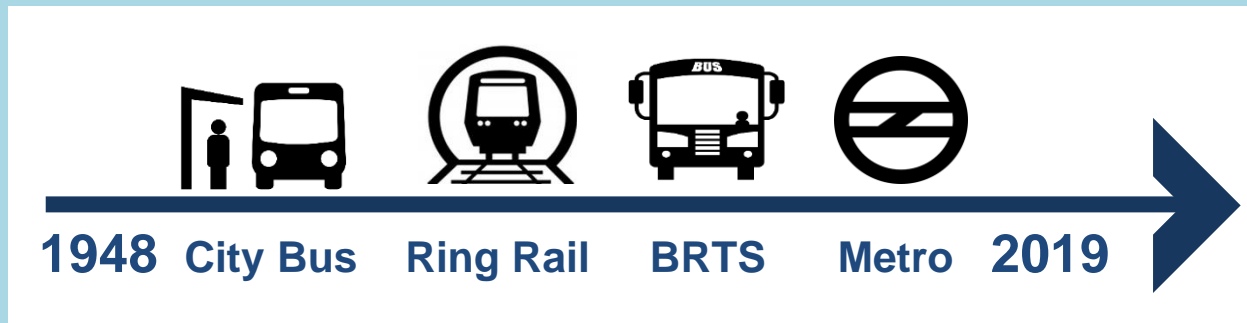
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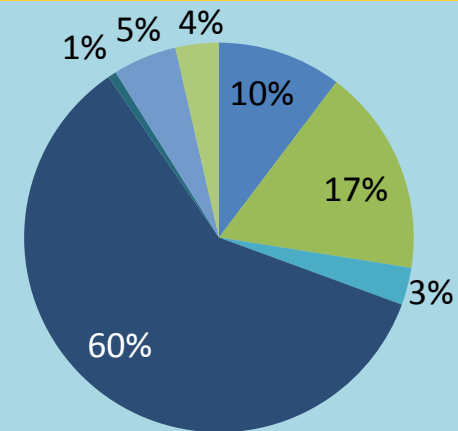


INTRODUCTION

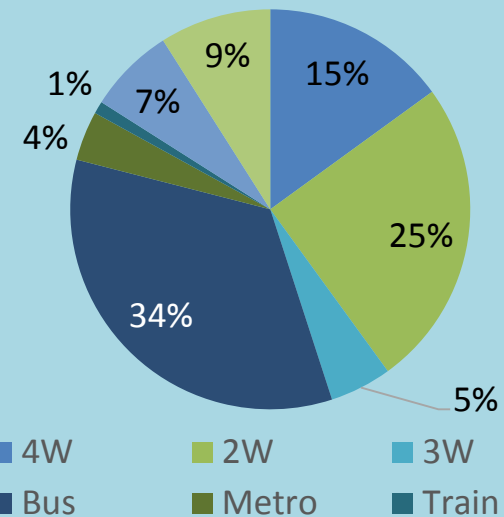
NEED OF STUDY



- NUTP (2006) encourages city development 'more for People and less for Cars' with focus on improving public transportation system of users
- NTDP (2014) Public Transport mode share for large cities: 38%
- In Delhi, Mode share of Public Transport has declined by 21% and Private vehicle increased by 13% in 9 Years.
- Factor Identification that influences users satisfaction is essential to enhance Quality of Service and increase patronage of Public Transport



2001



2010

Mode Share of Trips in Delhi

Source: Department of Transportation GNCTD 2008; Centre for Science & Environment 2010

Aim

‘To enhance the quality of services and increase the patronage of Public Transportation in Delhi’

Objective

- To identify the factor that influences satisfaction of public transport users

Scope and Limitations

- The study is focused on User Perception
- Perception surveys are done for capturing Satisfaction and Importance of Bus and Metro users
- Surveys are done at Bus Stops and Metro Stations with respect to selected metro Lines

RESEARCH METHODOLOGY

LITERATURE REVIEW

USER
PERCEPTIONS

MULTIMODAL
INTEGRATION

MULTIMODAL
TRANSFER

TOOLS &
TECHNIQUES

OBJECTIVE

To Identify
Factors
that Influences
Satisfaction of
Public Transport
Users

DATA REQUIRED

Identification of
Attributes of User
Satisfaction

Factors
adopted from Cheriyan,
C. (2015)

Formulation of
Focused groups

PRIMARY SURVEY & ANALYSIS

Site Visit
With Structured
Questionnaire
of User
Importance and
Satisfaction
ratings for
Selected
Variables

IS Analysis
+
SEM

To assess the
collected
responses

OUTPUT

Factors
influencing
user's
satisfaction
With respect
to transfers
type and
Passenger
Group

Conclusions

LITERATURE STUDY

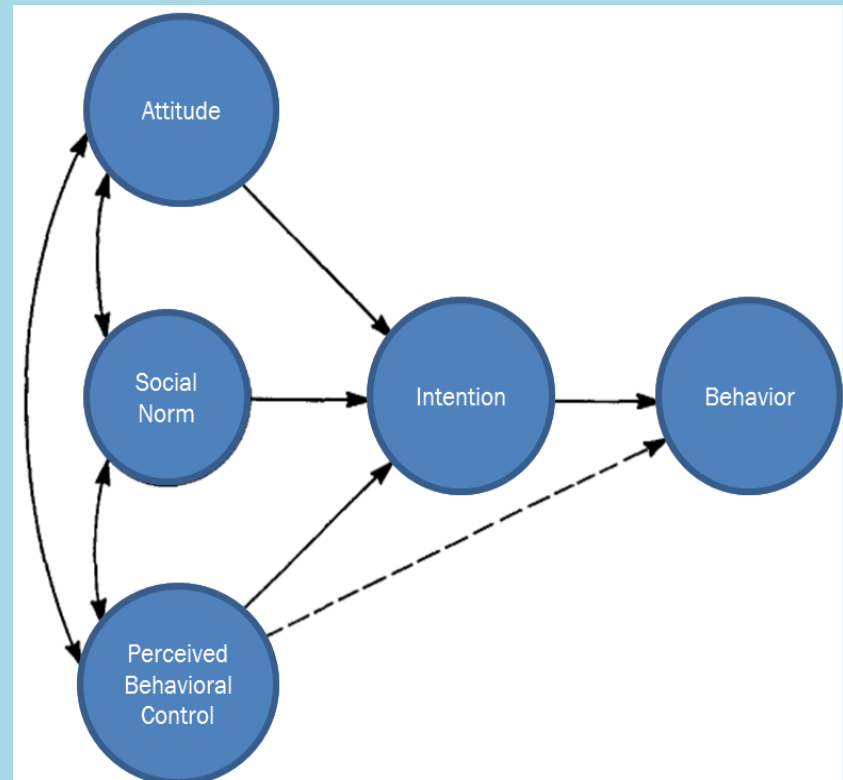
USER PERCEPTION

Theory of Planned Behavior (TPB) – Icek Ajzen (1991)

- TPB intent to **reflect users behavior** based on **willingness to change** choice
- According to *Ajzen* **Improvement in Level of Service** is necessary to **increase Ridership** But this **can be limited** when influenced with user travelling Behavior

Theory of Consumer Satisfaction (1980)

- According to the theory: Initially the **expectation is formed** by the consumer, and then **with respect of the system performance, satisfaction is derived**
- Consumer Satisfaction study attempt to **assess user attitude** towards Product, Service or Brand and **prioritize specific area** that needs to improvements

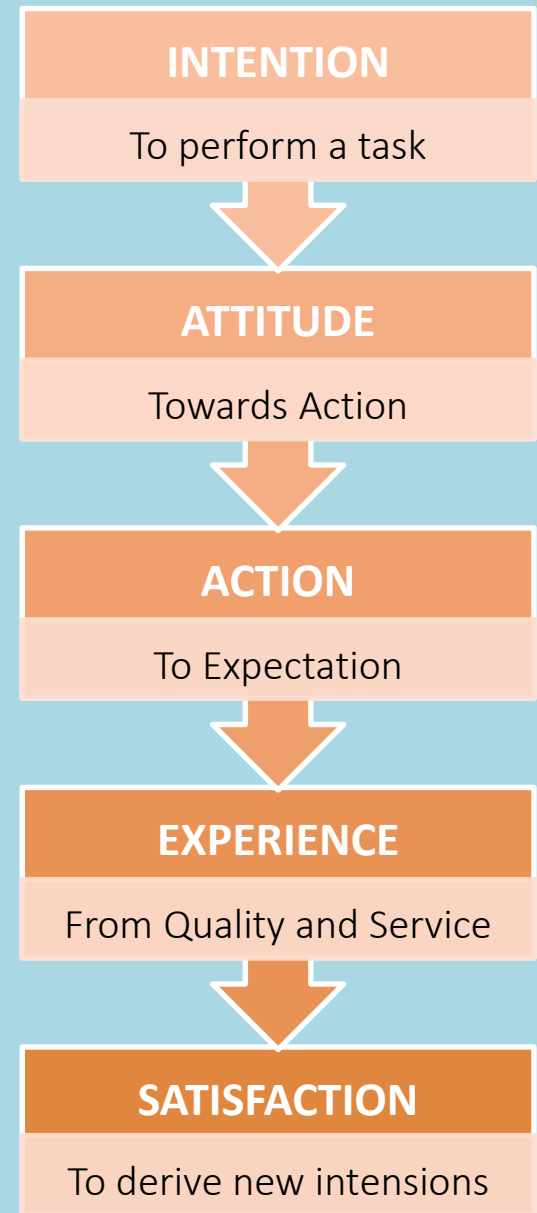


LITERATURE STUDY

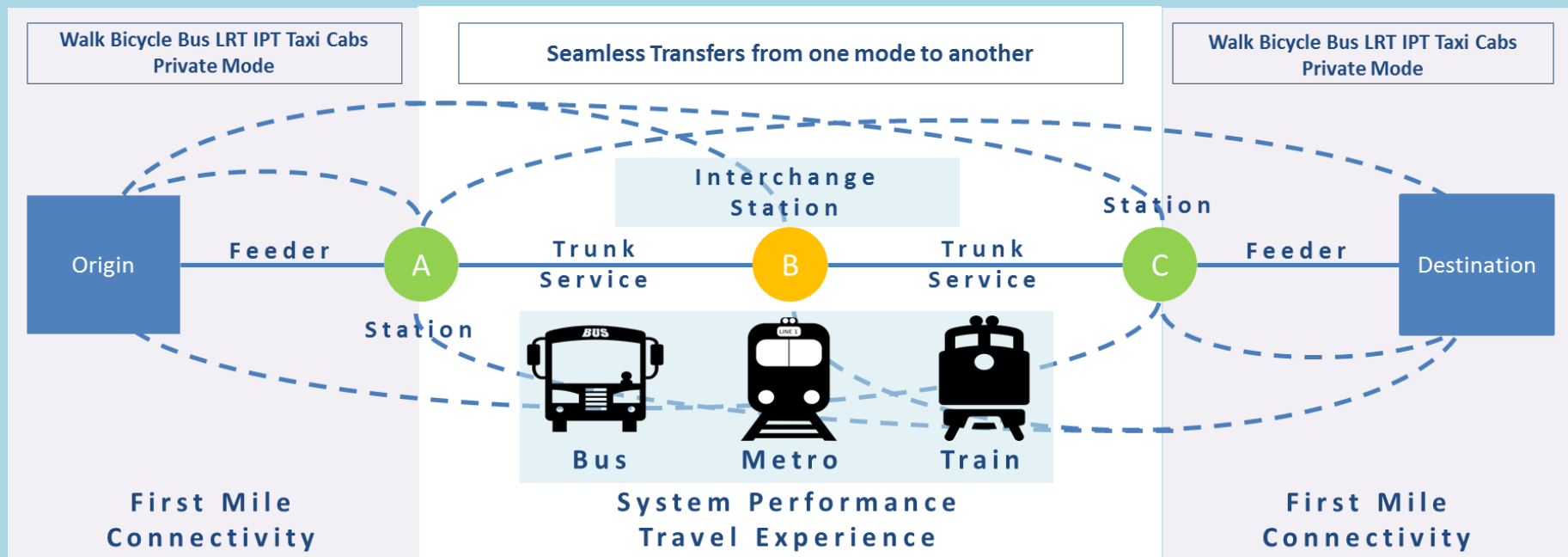
USER PERCEPTION

- According to *Daniel McFadden* – Both **User Behavior** and **Services** derives Consumer Satisfaction
- According to *Arroyo et al.*, - passenger's travelling behaviour are based on '**Actively Travelling Comparison**' which means 'more the people use modes, more they are attracted towards there modes Choice' and each mode have its own influencing factor

Behavior	<ul style="list-style-type: none">• Users choice based on willingness to change the choice• According to the theory, inadequate connectivity/transfer facilities may lead to force passenger to seek for an alternative option to reach the desired destination
Satisfaction	<ul style="list-style-type: none">• Consumer Satisfaction suggest that Users form Satisfaction Judgement by evaluation experiences



MULTIMODAL INTEGRATION

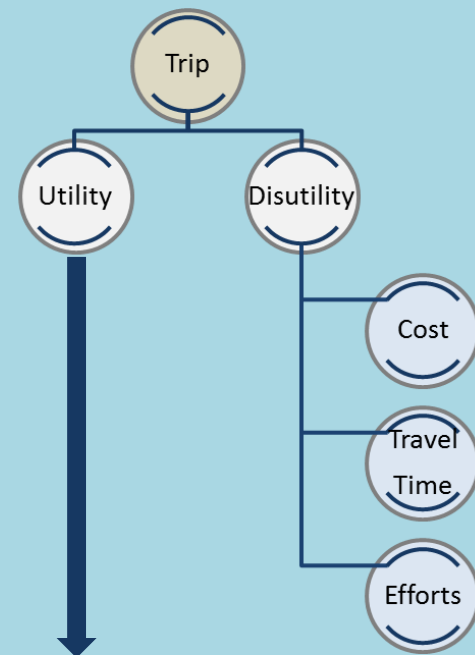
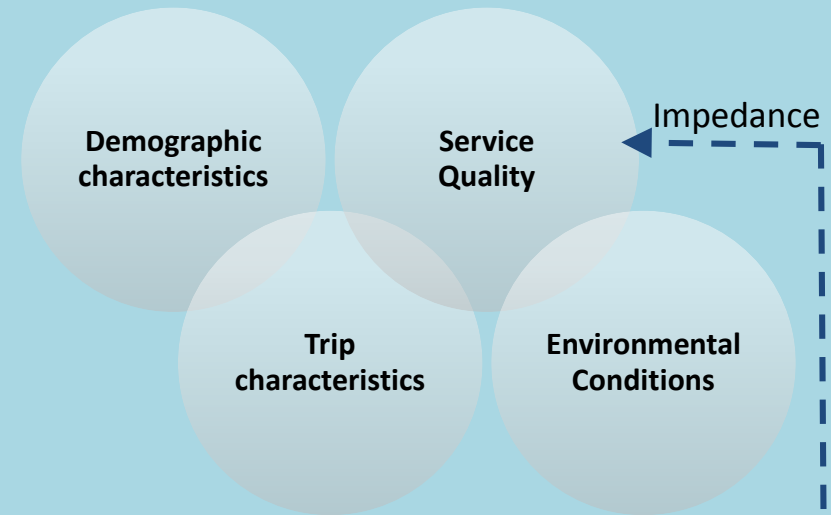


“**Coordination of services** to form a uniform system which operates on a common platform that provide **seamless travelling** through different modes of Transportation to the commuters”

- In a multimodal trip, **transfer plays an important role**
- Presence of **quality of transfers determine selection of mode**

Sources: Performance Evaluation of Multimodal Transportation Systems 2013, Inter-modality for public transport in a metropolitan area, Key success factors of Integrated Transport System 2013; Assessment of Potential Improvement to Metro-Bus Transfer in Bangkok, Thailand (2012), An Investigation of Public Transport Users' Willingness to Select routes with Transfers (2014)

MULTIMODAL TRIP



- Change in level or distance of transfer
- Increase in transfer time
- Longer waiting time
- Weather conditions
- Penalties for the transfer of different modes (eg. Bus to Metro transfer) are larger than the penalties for the transfer within the same modes (eg: Bus to Bus, Metro to Metro)

$$U = \beta_1 t_{\text{bus}} + \beta_2 t_{\text{train}} + \beta_3 t_{\text{transfer}} + \beta_4 C + \beta_5 \delta$$

t_{bus} = in- vehicle time in bus

t_{train} = in- vehicle time in train

t_{transfer} = time between arrival of mode (bus/ train) & departure of other

C = Total cost of trip

δ = penalty or the effort needed for transfer

$\beta_{1...5}$ = weights attached to each element of disutility

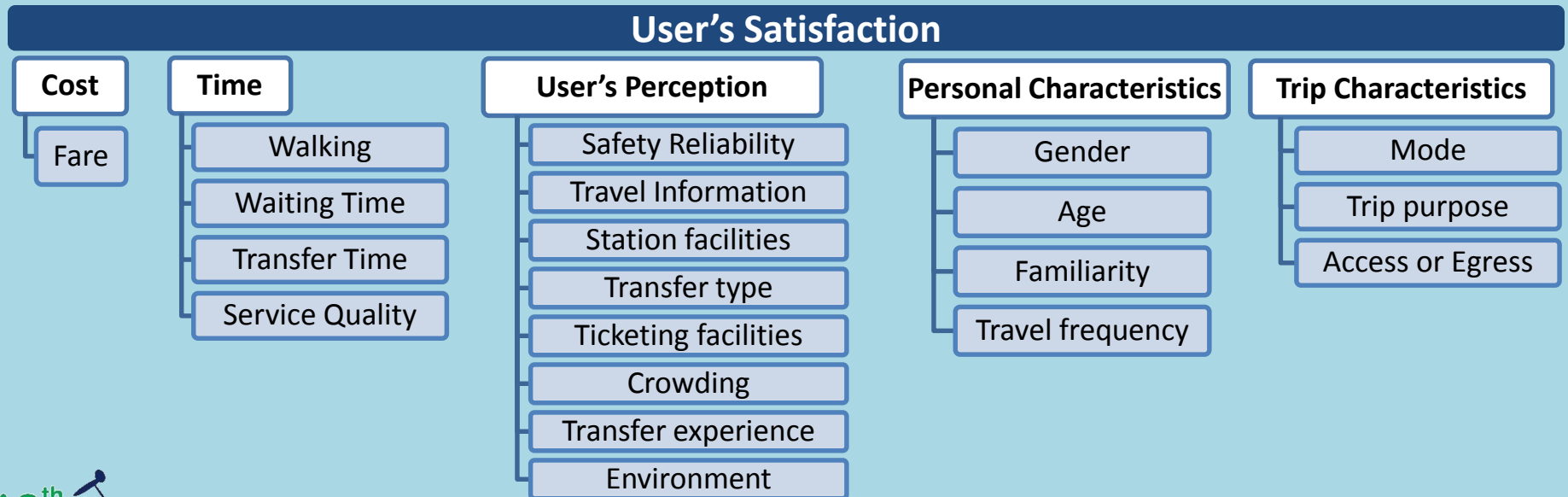
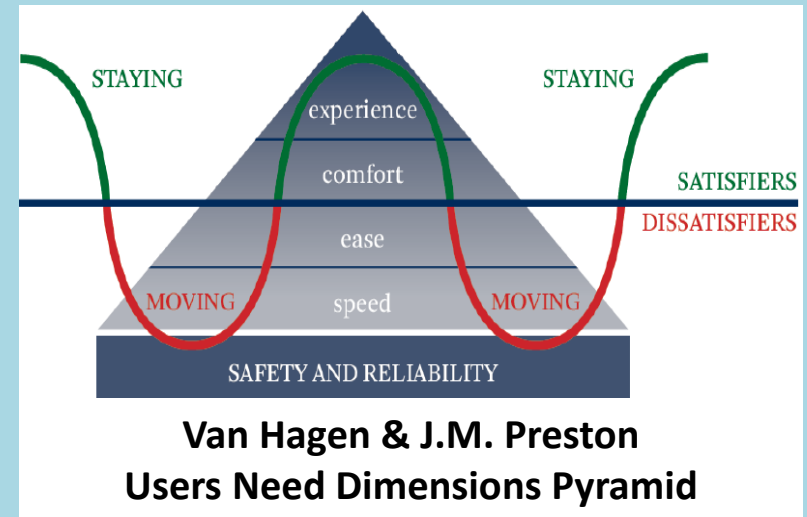
Out vehicle time

Walk - Wait - Transfer

Sources: Valuation of a Transfer in a Multimodal public transport trip (Schakenbos, 2014), User perception of transfers in multimodal urban trips (Cascajo, Lopez, Herrero, & Monzon, 2018), Estimating the Passenger Cost of Station Crowding (Douglas & Karpouzis, 2016), Exploring passenger anxiety associated with train travel (Cheng, 2010), How Do People Perceive Service Attributes at Transit Facilities? (Iseki & Smart, 2012)

MULTIMODAL TRANSFERS

- VAN HAGEN (1961), identifies the hierarchy of user's need according to the importance
- **Safety and Reliability** are the two most important dimensions followed by satisfaction, ease, comfort and experience
- J.M PRESTON (2008), **Ease & Speed** are important for the moving travellers while **Experience and Comfort** are important for staying travellers



TOOLS & TECHNIQUES

Research (Author, Year)	Objective(s)	Tools & Techniques	Determinants	Findings
User perception of transfers in multimodal urban trips: A qualitative study (Cascajo, Lopez, Herrero, & Monzon, 2018)	To identify the factors affecting user perception of transfers to reduce the penalty associated with transfers by comparing two cities- Vitoria Gasteiz and Madrid	Stated Preference Method	Built, environment, Pure Penalty, Personal, transfer & trip characteristics, Time (with sub-Categories)	Identification of 2 new factors- mental effort & activity disruption

Focus Groups

Vitoria-Gasteiz

- Workers/Student + age<65 years
- Retired + age>65

Madrid

- Young adults age <30 years
- Adult workers + age <65
- Retired + age >65

Table 2. Summary of statistics on focus groups participants.

		Young adults Madrid	Adults		Elderly	
			Madrid	Vitoria	Madrid	Vitoria
Participants		8	7	6	5	4
Age (mean, years)		24.0	40.1	35.0	73.6	69.5
Male		62.5%	28.6%	50.0%	20.0%	50.0%
Frequency of PT use	Every day	50.0%	85.7%	50.0%	20.0%	50.0%
	Every week	12.5%	14.3%	33.3%	60.0%	25.0%
	Occasionally	37.5%	0.0%	16.7%	20.0%	25.0%
	Never	0.0%	0.0%	0.0%	0.0%	0.0%
Trip motive	Work	33.3%	100.0%	66.7%	0.0%	0.0%
	Study	83.3%	14.3%	16.7%	0.0%	0.0%
	Leisure	66.7%	85.7%	83.3%	100.0%	50.0%
	Other	33.3%	85.7%	33.3%	80.0%	75.0%
Make transfers		100.0%	100.0%	83.3%	100.0%	100.0%
Type of transfer most used	Bus-bus	0.0%	42.9%	83.3%	80.0%	100.0%
	Rail mode*bus	66.7%	57.1%	50.0%	20.0%	25.0%
	Bus-rail mode	33.3%	57.1%	33.3%	40.0%	0.0%
	Rail mode-rail mode	100.0%	100.0%	0.0%	80.0%	0.0%

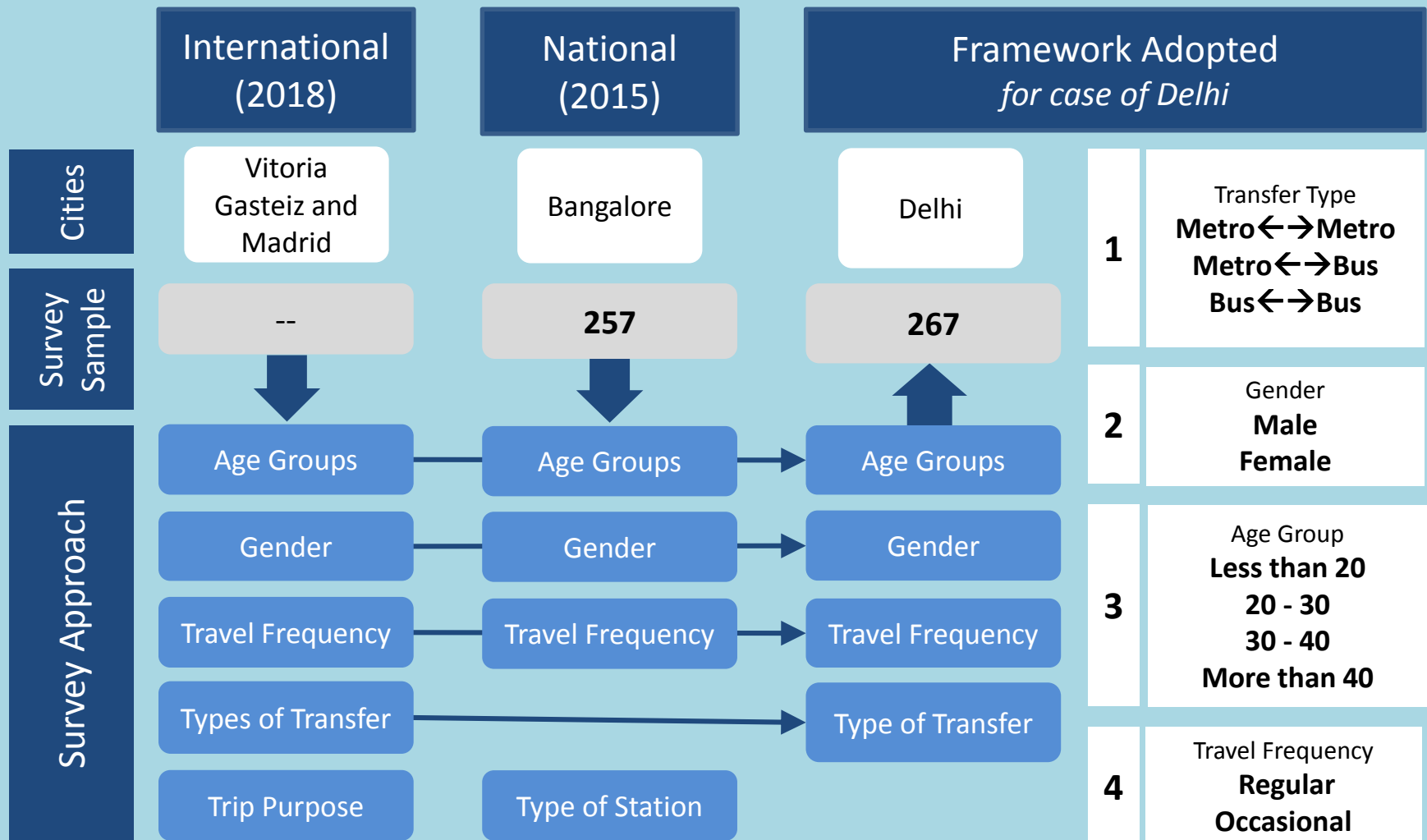
*Rail mode is metro in Madrid and light rail in Vitoria.

TOOLS & TECHNIQUES

Research (Author, Yr)	Objective(s)	Tools & Techniques	Determinants
Assessment of Transit Transfers Experience: Case of Bangalore Cheriyen, C. (2015)	To evaluate the role of transfers in public transport journey for passengers	IS Analysis Structural Equation Modelling	Station Design, Service/ Reliability, Fares & Ticketing System, Information, Amenities, Safety & Security (with sub-Categories)
Factors		Variables	
Station / Facility Design		Access Time between two modes is < 5 Min	
		Walking Time during transfers	
		Adequate Lighting facility inside Station	
		Ease of Accessibility to the Stations	
Service/Reliability		Waiting time at Station is Less	
		Services arrive in every 2 Mins (Frequency)	
Fares and Ticketing System		No added fares in switching modes	
		Purchasing tickets takes less times	
Information		Adequate wayfinding facilities at station	
		Availability of Route map	
		Availability of Help Desk at Stations	
Amenities		Availability of Seats at waiting area	
		Environment at station is Comfortable	
		Stations/Stops are Clean	
		Availability of amenities (Rest Rooms)	
		Basic facilities are easily accessible at station	
Safety and Security		Using public transport during day/night is Safe	
		Security guards are present at stations	

Source: Assessment of Transit Transfers Experience: Case of Bangalore Cheriyen, C. (2015)

TOOLS & TECHNIQUES

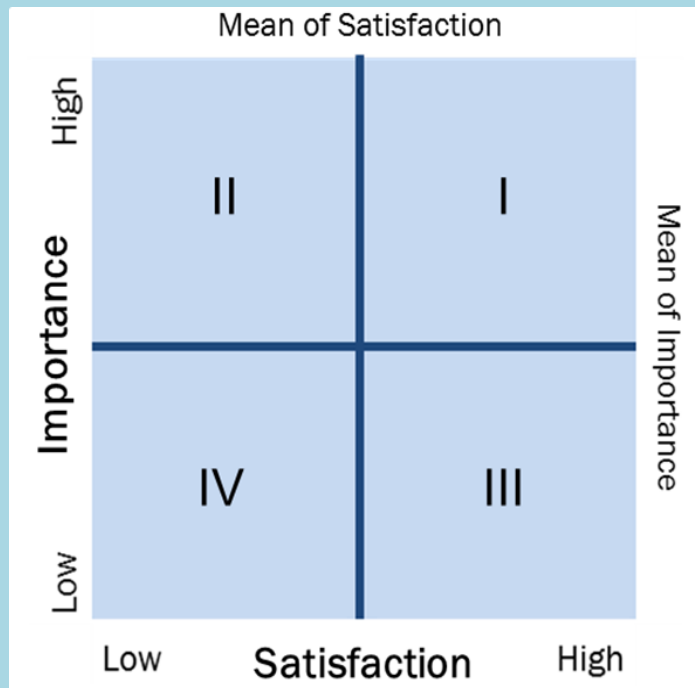


TOOLS & TECHNIQUES

Importance Satisfaction Analysis (I-SA)

$$IS = \text{Importance} \times (1 - \text{Satisfaction}) \rightarrow \text{Importance} \times \text{Dissatisfaction}$$

- ISA is based on concept of emphasizing improvement to achieve overall satisfaction of users
- This technique is idealistic for the situations when financial resources are limit and investments are needed to improve the performance of service



Cartesian Diagram

High Importance With High/Low Satisfaction

- Need to be Maintained
 - Determines High Priority
- Q I – Continued Emphasis**
Services are meeting users expectations
- Q I I – Priority Improvement**
Not performing well and Most Important for Users. Needs Significant Improvements

Low Importance With High/Low Satisfaction

- Less Focus / No Improve
 - Determines Low Priority
- Q I I I – Exceeded Expectation**
Services are performing higher than users expectations
- Q I V – Less Important**
Services not performing well and also not important for users

TOOLS & TECHNIQUES

Structural Equation Modelling (SEM)

- SEM is a tool to identify the factor that determines the satisfaction of public transport commuters based on the performance of the system
- Factor which are most dominant within the responses or commonly proves the dissatisfaction to the users can be highlighted with Structural Equation Method

$$Y = \beta X + e$$

Where,
X = Satisfaction
Y = User Preferences/Ratings
e = Measurement of error term
 β = Regression Weight
(Regression Coefficient of Beta)

KMO and Bartlett's Test:

Indicates Suitability of Data for Structure Detection

Principal Component Analysis

To Identify Linearly Uncorrelated variable called Components

Rotated Component Matrix

Determine Relation of Variable and Components

Regression Coefficient

Determines Impact of Components (or set of Variable)

PRIMARY SURVEY

2019

Location	Anand Vihar ISBT Terminal	Rajiv Chowk Metro Station
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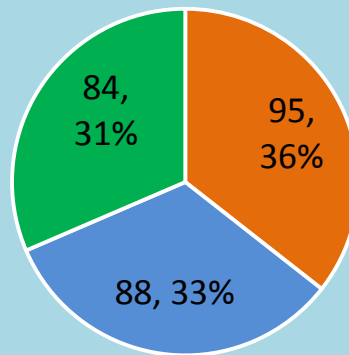
Rational for Station Selection:

- Rajiv Chowk Station is Located in City Center and operating since 2010 as One of the Busiest Interchange Metro Station in Delhi NCT
- Anand Vihar is one of the Major Station which Connects City Bus services to Regional Bus Services and Metro Lines

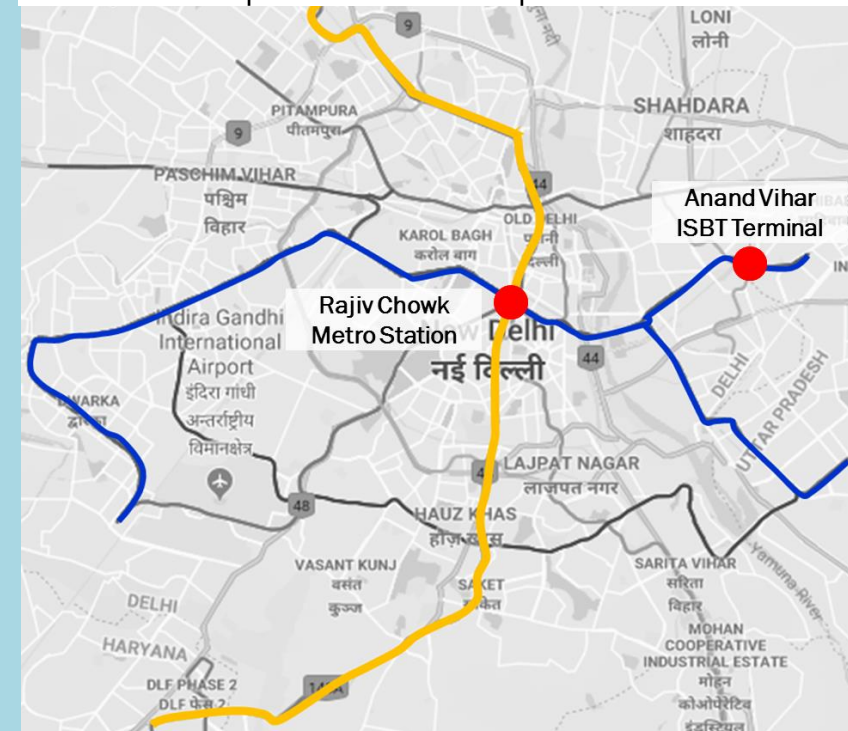
Transfer	Metro \leftrightarrow Bus	Bus \leftrightarrow Bus	Metro \leftrightarrow Metro
Survey Sample Size	88	84	95

Balanced Surveys has been collected from each transfer groups.

- Metro-Metro
- Metro-Bus
- Bus-Bus



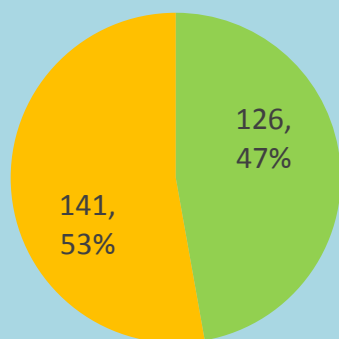
Station	Type of Station	Transfer Type
Rajiv Chowk	Transit Station	Metro \leftrightarrow Metro
Anand Vihar	Intermodal Terminal	Bus \leftrightarrow Metro Bus \leftrightarrow Bus



Map Showing Survey Locations with DMRC lines in Delhi NCT (Image source: Google Maps)

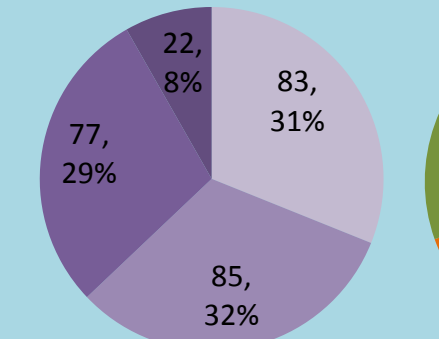
PRIMARY SURVEY

SOCIO-DEMOGRAPHIC CHARACTERISTICS



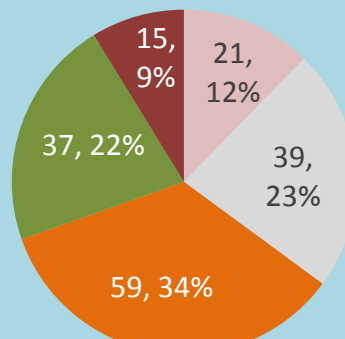
Female Male

Gender



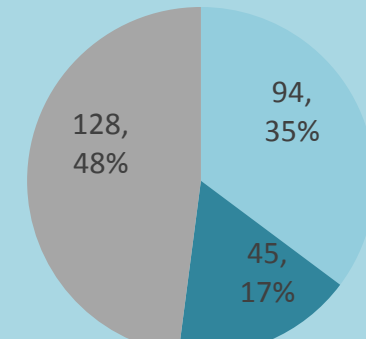
Less than 20 20 - 30
30 - 40 More than 40

Age Group



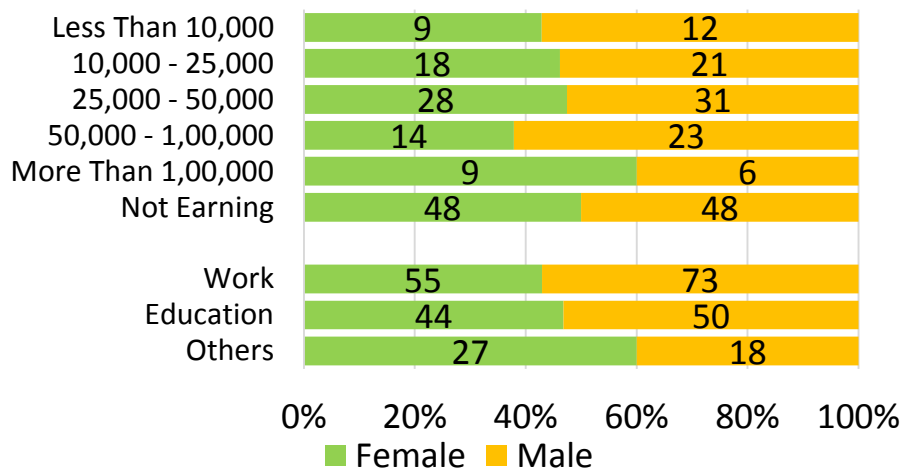
Less Than 10,000
10,000 - 25,000
25,000 - 50,000
50,000 - 1,00,000
More Than 1,00,000

Income Group



Education Others Work

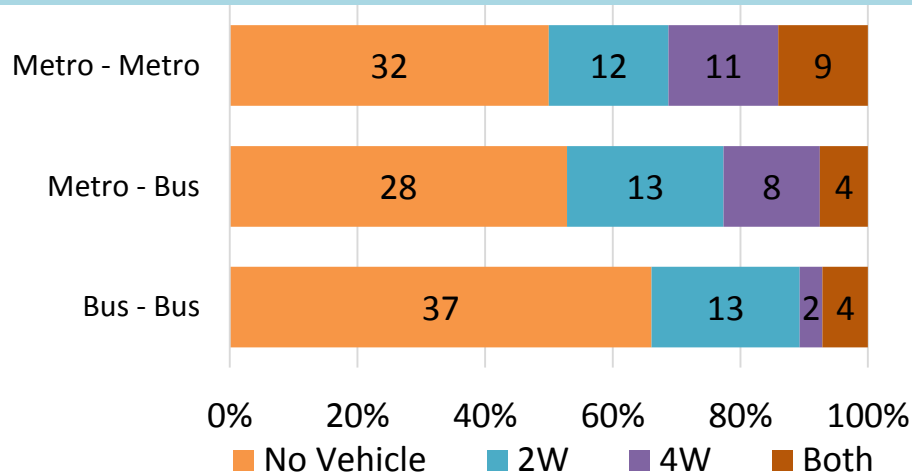
Trip Purpose



0% 20% 40% 60% 80% 100%

Female Male

**Income Group and Trip Purpose
w.r.t Gender**



0% 20% 40% 60% 80% 100%

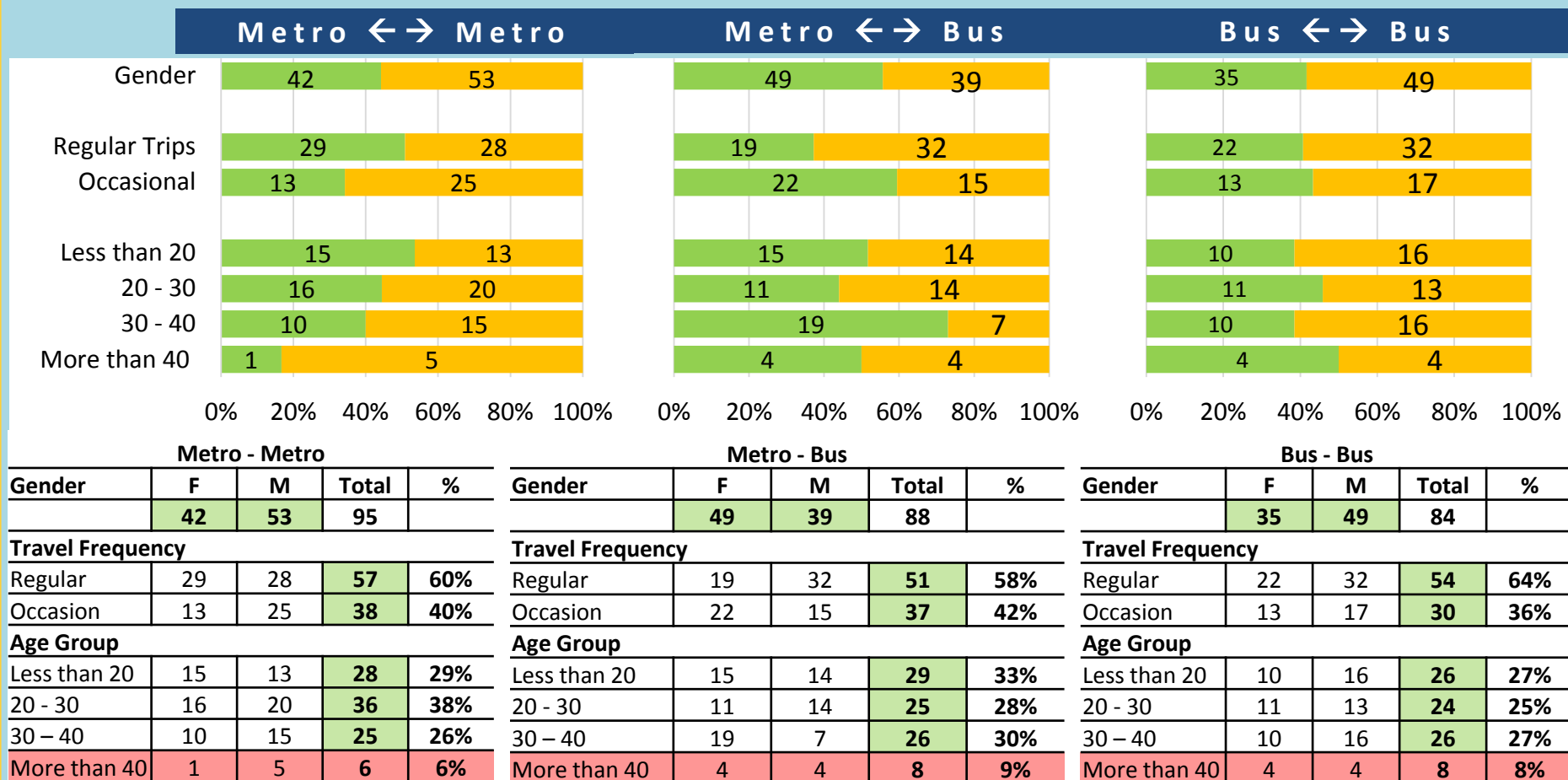
No Vehicle 2W 4W Both

**Vehicle Ownership w.r.t to
Transfer Type**

Source: Primary Survey, 2019

PRIMARY SURVEY

SOCIO-DEMOGRAPHIC CHARACTERISTICS

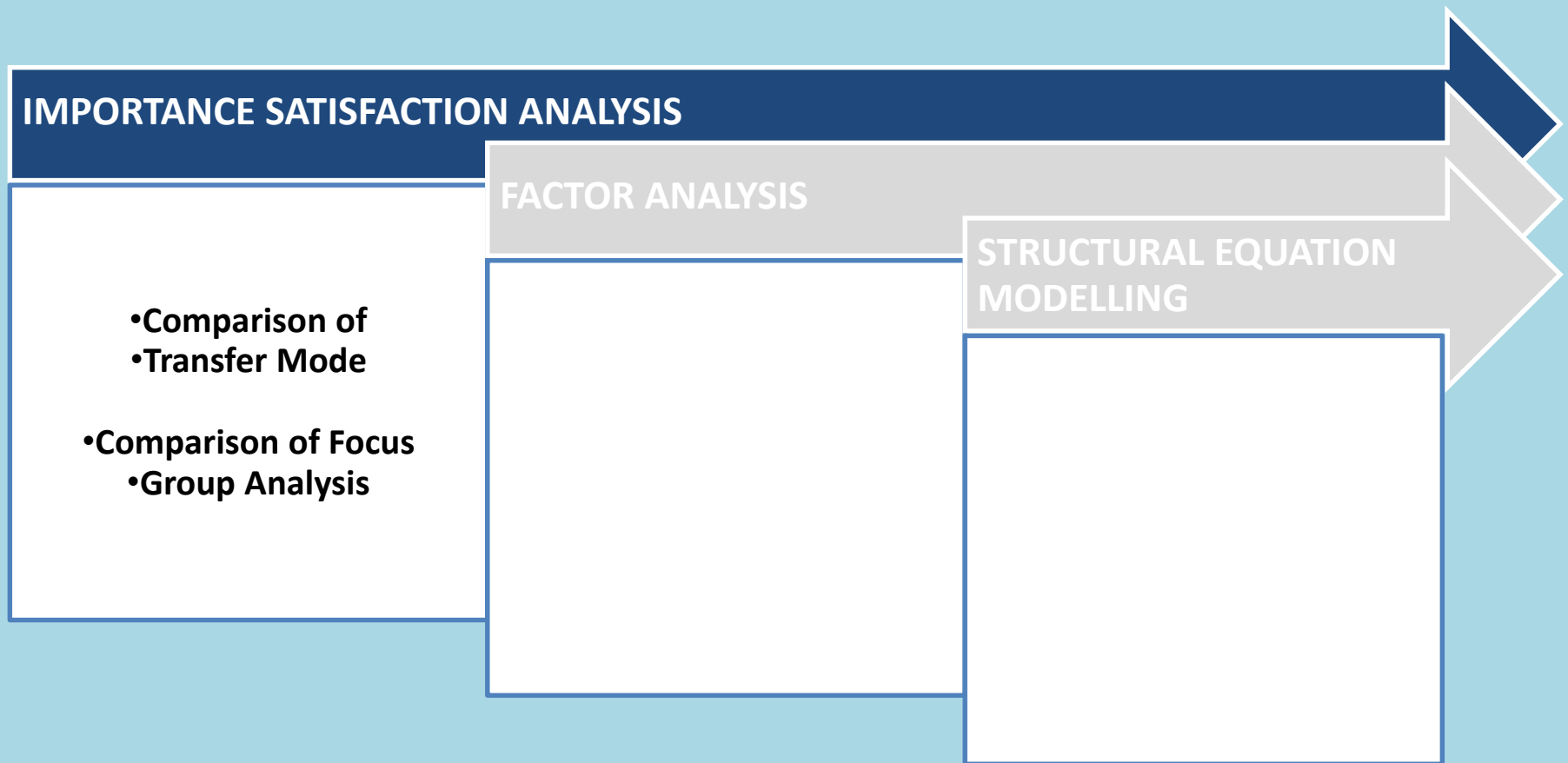


- Adequate Data Collected for Focused Group for Satisfaction Analysis
- Survey Sample for **More than 40** Age are not considered in analysis due to very small sample size

Legend ■ Female ■ Male

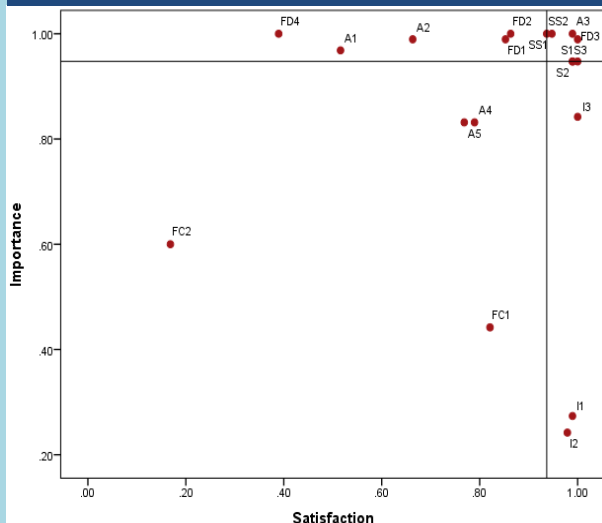
Source: Primary Survey, 2019

SATISFACTION ANALYSIS PROCESS

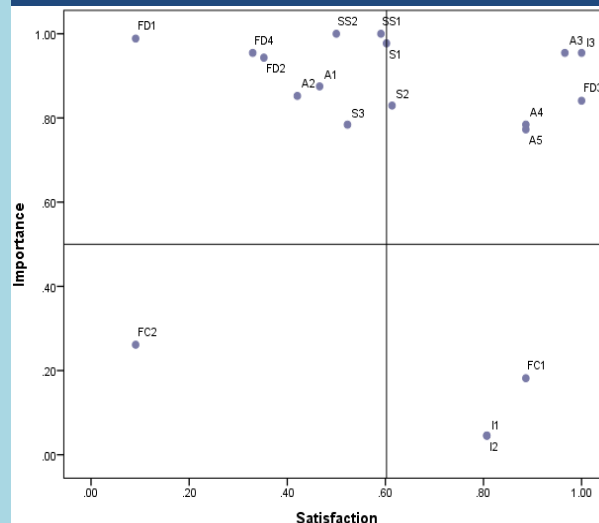


I-S ANALYSIS BASED ON TRANSFER TYPE

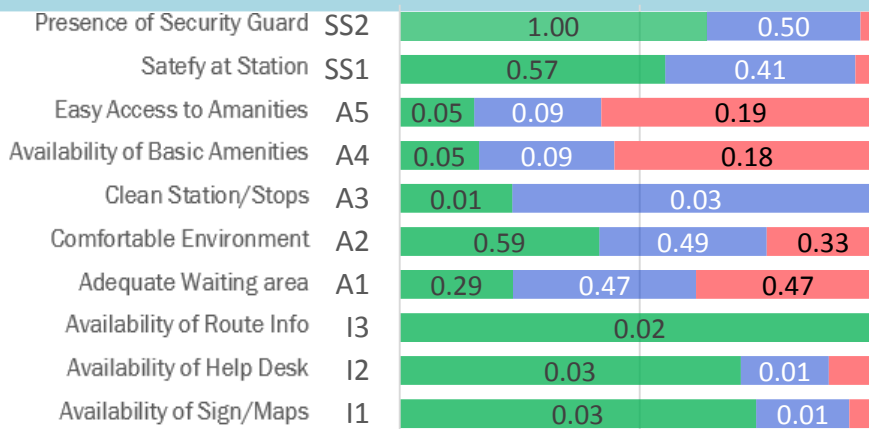
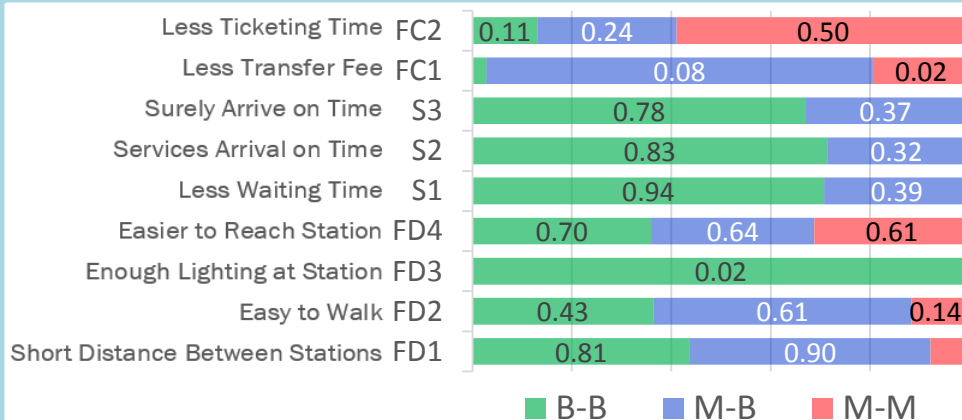
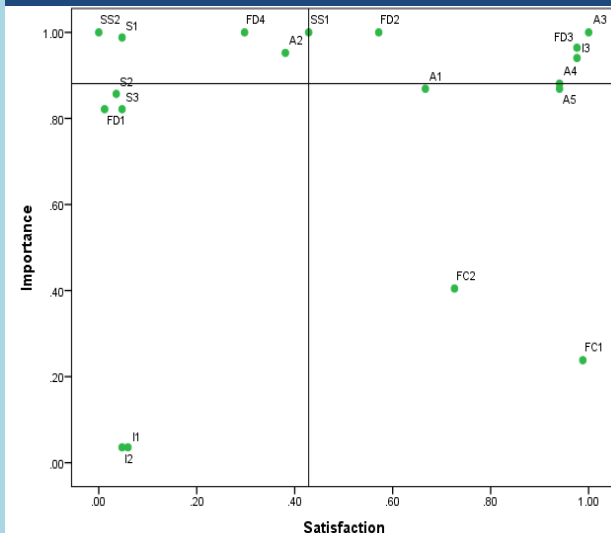
Metro ↔ Metro



Metro ↔ Bus



Bus ↔ Bus



- Bar Charts Showing Comparison of Dissatisfaction of Public Transport Users during Transfers

Transfer Type	B-B	M-B	M-M
IS Score	7.27	5.59	2.80

Source: Primary Survey, 2019

I-S ANALYSIS BASED ON FOCUSED GROUP

Variables	Code	Metro ↔ Metro							Metro ↔ Bus							Bus ↔ Bus						
		Gender		Travel Frequency		Age Group			Gender		Travel Frequency		Age Group			Gender		Travel Frequency		Age Group		
		M	F	R	O	<20	20-30	30-40	M	F	R	O	<20	20-30	30-40	M	F	R	O	<20	20-30	30-40
Short Transfer Distance	FD1	1	1	1	1	1	1	1	2	2	2	2	2	2	2	2	2	2	2	2	2	2
Easy to Walk	FD2	1	1	1	1	1	1	1	2	2	2	1	2	2	1	1	1	1	3	1	1	1
Enough Lighting at Station	FD3	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1
Easier to Reach Station	FD4	2	2	2	1	2	2	2	2	2	2	2	2	2	2	2	2	2	2	2	2	2
Less Waiting Time	S1	1	1	1	1	1	1	1	1	1	1	1	2	2	1	2	2	2	2	2	2	2
Services Arrival on Time	S2	1	1	1	1	1	1	1	1	1	1	1	1	1	1	2	2	2	2	2	2	2
Surely Arrive on Time	S3	1	1	1	1	1	1	1	1	2	1	1	1	1	1	2	2	2	2	2	2	2
Less Transfer Fee	FC1	2	2	1	1	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3
Less Ticketing Time	FC2	3	3	2	2	2	2	2	4	4	4	4	2	4	4	3	3	3	3	3	3	3
Availability of Sign/Maps	I1	1	3	3	3	3	3	3	3	3	3	3	3	3	3	4	4	4	4	4	4	4
Availability of Help Desk	I2	1	3	3	3	3	3	3	3	3	3	3	3	3	3	4	4	4	4	4	4	4
Availability of Route Info	I3	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1
Adequate Waiting area	A1	1	1	1	1	1	1	2	2	1	2	1	2	1	2	1	1	1	1	1	1	1
Comfortable Environment	A2	1	1	1	1	1	1	1	2	2	2	2	2	1	2	2	2	2	2	2	2	2
Clean Station/Stops	A3	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1
Availability of Basic Amenities	A4	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1
Easy Access to Amanities	A5	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1
Safety at Station	SS1	1	1	1	1	1	1	1	1	1	1	2	1	2	2	2	2	2	2	2	2	1
Presence of Security Guard	SS2	1	1	1	1	1	1	1	1	2	2	1	2	2	2	2	2	2	2	2	2	2
		1	Need to Maintain						2	Need Improvement						3/4	Less Important					

Table Showing Quadrant from I-S Analysis for each Focused Group

Source: Primary Survey, 2019

SATISFACTION ANALYSIS PROCESS

IMPORTANCE SATISFACTION ANALYSIS

- Comparison of
- Transfer Mode

- Comparison of Focus
- Group Analysis

- Metro \leftrightarrow Metro Transfer: Dissatisfied with **Accessibility**
- Bus User are Least Satisfied with **Accessibility, Reliability (Services), Comfort and Safety**

FACTOR ANALYSIS

KMO and Bartlett's Test

Principal Component
Analysis

Rotated Component
Matrix

STRUCTURAL EQUATION MODELLING

FACTOR ANALYSIS

Step 1:

KMO and Bartlett's Test:

Indicates Suitability of Data for Structure Detection (>0.50)

Step 2:

Principal Component Analysis

Converts a set of observation of possible Correlated variable to set of Linearly Uncorrelated variable called Components

The Table shows extracted components explains 74% of variability in original 19 Variables

KMO and Bartlett's Test									
Kaiser-Meyer-Olkin Measure of Sampling Adequacy								.790	
Bartlett's Test of Sphericity				Approx. Chi-Square			3636.514		
				df			171		
				Sig.			.000		
Component	Initial Eigenvalues			Extraction Sums of Squared Loadings			Rotation Sums of Squared Loadings		
	Total	% of Variance	Cumulative %	Total	% of Variance	Cumulative %	Total	% of Variance	Cumulative %
1	6.329	33.312	33.312	6.329	33.312	33.312	6.080	32.001	32.001
2	2.035	10.713	44.025	2.035	10.713	44.025	1.994	10.495	42.496
3	1.931	10.163	54.188	1.931	10.163	54.188	1.788	9.411	51.907
4	1.304	6.866	61.053	1.304	6.866	61.053	1.487	7.824	59.731
5	1.289	6.784	67.837	1.289	6.784	67.837	1.425	7.502	67.234
6	1.070	5.630	73.468	1.070	5.630	73.468	1.184	6.234	73.468
7	.912	4.798	78.266						
8	.800	4.208	82.474						
9	.726	3.820	86.294						
10	.580	3.052	89.346						
11	.478	2.516	91.863						
12	.423	2.226	94.088						
13	.306	1.613	95.701						
14	.266	1.400	97.101						
15	.180	.948	98.049						
16	.139	.731	98.781						
17	.117	.618	99.398						
18	.104	.548	99.946						
19	.010	.054	100.000						

Extraction Method: Principal Component Analysis.

Table Showing Total Variance Results from PCA

Source: Primary Survey, 2019

FACTOR ANALYSIS

Variables	Code	Component					
		1	2	3	4	5	6
Less Waiting Time	S1	.904					
Services Arrival on Time	S2	.889					
Presence of Security Guard	SS2	.879					
Surely Arrive on Time	S3	.827					
Availability of Help Desk	I2	.826					
Availability of Sign/Maps	I1	.824					
Safety at Station	SS1	.792					
Short Distance Between Stations	FD1	.713					
Availability of Basic Amenities	A4		.914				
Easy Access to Amenities	A5		.848				
Less Transfer Fee	FC1			.712			
Less Ticketing Time	FC2			.640			
Easy to Walk	FD2			.519			
Comfortable Environment	A2				.751		
Adequate Waiting area	A1				.578		
Availability of Route Info	I3					.827	
Easier to Reach Station	FD4						.864
Extraction Method: Principal Component Analysis. Rotation Method: Varimax with Kaiser Normalization.							
a. Rotation converged in 20 iterations.							

Table Showing Rotated Component Matrix

Component	Variables	Codes
Reliability and Safety	Less Waiting Time	S1
	Service arrive on Time	S2
	Presence of Security Guard	SS2
	Availability of Help Desk	I2
	Availability of Sign/Maps	I1
	Safety at Station	SS1
	Short Distance Between Stations	FD1
Amenities	Availability of Basic Amenities	A4
	Easy Access to Amenities	A5
Integration	Less Transfer Fee	FC1
	Less Ticketing Time	FC2
	Easy to Walk	FD2
Comfort and Waiting	Comfortable Environment	A2
	Adequate Waiting area	A1
Information	Availability of Route Info	I3
Accessibility	Easier to Reach Station	FD4

Step 3:

Rotated Component Matrix

- Output of Principal Component Analysis
- Contains Correlation of Variables and Components
- Correlation taken is More than 0.5

Step 4:

New Components are defined from Rotated Matrix Results

Source: Primary Survey, 2019

SATISFACTION ANALYSIS PROCESS

IMPORTANCE SATISFACTION ANALYSIS

- Comparison of
- Transfer Mode

- Comparison of Focus
- Group Analysis

- Metro \leftrightarrow Metro Transfer: Dissatisfied with **Accessibility**
- Bus User are Least Satisfied with **Accessibility, Reliability (Services), Comfort and Safety**

FACTOR ANALYSIS

KMO and Bartlett's Test

Principal Component Analysis

Rotated Component Matrix

- Extracted 6 components explains 74% of variability in original 19 Variables

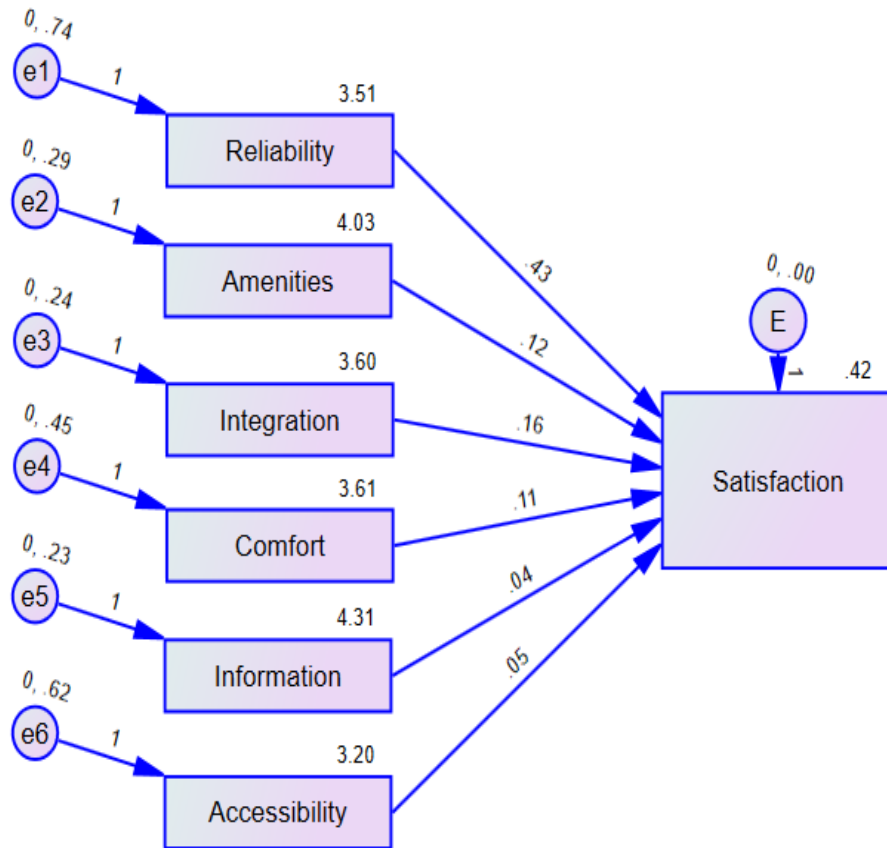
STRUCTURAL EQUATION MODELLING

Mean Value of Rating for New Compound Group

Identify Impact of Component on Satisfaction

SEM Results Comparison based on Focused Group

SEM ANALYSIS



Regression Coefficient of Components Using SEM

Components	Estimate	Std Error	Critical Ratio	p-Value
Reliability & Safety	0.937	0.002	180.964	***
Amenities	0.163	0.004	31.532	***
Integration	0.197	0.004	37.994	***
Comfort & Waiting	0.194	0.003	37.404	***
Information	0.046	0.004	8.978	***
Accessibility	0.099	0.003	19.2	***

Step 5:

Mean Value for Ratings for New Components as input values for SEM

SEM is done using IBM SPSS AMOS Software

SEM Results:

- **Amenities, Integration and Comfort** are factors that influences the satisfaction of Users
- **Reliability & Safety** has the highest Influence on Satisfaction
- **Information and Accessibility** have least influence on Public Transport User Satisfaction

SEM BASED ON TRANSFERS

For Metro - Metro Transfers:

- **Accessibility** is most influencing factor

Based on Groups:

- **Male Group** → **Accessibility**
- **Female Group** → **Safety and Ticketing**
- **Regular Travels** → **Information**
- **Age < 20** → **Accessibility & Facilities**

For Metro - Bus Transfers:

- **Service and Safety** are most influencing factor

Based on Groups:

- **Female Group** → **Safety and Services**
- **Age < 20** → **Safety**

For Bus – Bus Transfers:

- **Service and Information** are most influencing factor

Based on Groups:

- **Female Group** → **Safety and Services**
- **Age < 20** → **Ticketing and Amenities**

Commuter Group	Gender		Frequency		Age			Over All
Sub Group	M	F	R	O	< 20	20-30	30-40	
Mode	Metro ↔ Metro							
Accessibility	0.37	0.04	0.25	--	0.48	0.37	0.20	0.38
Service	0.14	0.15	--	0.28	--	0.16	0.08	0.12
Safety	0.16	0.43	0.07	--	--	0.16	--	--
Information	--	0.10	0.43	0.18	--	--	0.55	0.00
Facilities Design	0.20	0.07	0.15	0.26	0.52	0.19	0.11	0.23
Mode	Metro ↔ Bus							
Safety	0.11	0.22	0.11	0.14	0.31	0.18	0.11	0.20
Accessibility	0.13	0.11	0.13	0.25	0.07	0.25	0.14	0.13
Comfort	0.13	0.11	0.11	0.10	0.10	0.12	0.13	0.11
Facilities Design	0.15	0.13	0.16	0.14	0.12	0.13	0.24	0.12
Amenities	0.11	0.08	0.10	0.15	0.11	0.13	0.10	0.09
Services	0.23	0.21	0.22	0.11	0.17	0.10	0.16	0.21
Mode	Bus ↔ Bus							
Service Information	0.29	0.30	0.33	0.31	--	0.34	0.28	0.32
Amenities	0.12	0.09	0.12	0.10	0.49	0.17	0.09	0.12
Safety	0.15	0.20	0.11	0.12	--	0.08	0.14	0.09
Ticketing	0.10	0.13	0.10	0.14	0.51	0.16	0.13	0.13
Facilities Design	0.19	0.14	0.18	0.13	--	0.14	0.13	0.16
Comfort	0.15	0.14	0.16	0.20	--	0.11	0.24	0.17

Source: Primary Survey, 2019

USER SATISFACTION

For Bus ↔ Metro Users

- Male Group → **Services**
- Occasional Groups → **Waiting**
- **Facility Design and Information** has less influence in both Delhi and Bangalore Case Studies

For Bus ↔ Bus Users

- **Services and Comfort** are common and highly influencing factors for both the case study
 - Male Groups → Facility Design
 - Female Group → Safety/Security
- **Waiting and Amenities** have Least Influence in both the studies

Transfers Type	Bus↔Metro					
Case Study	Bangalore (Mantri Square)					
Commuter Group	Male	Female	Regular	Occasional	Overall	
Comfort	0.08	0.19	0.17	0.27	0.16	
Safety	0.20	0.14	0.17	0.32	0.16	
Amenities	0.16	0.14	0.12	--	0.14	
Services Integrat.	0.16	0.14	0.15	--	0.14	
Information	0.12	0.14	0.15	0.14	0.14	
Waiting	0.20	0.19	0.17	0.27	0.16	
Facility Design	0.08	0.06	0.08	--	0.06	
Case Study	Delhi NCT					
Comfort	0.13	0.11	0.11	0.10	0.11	
Safety	0.11	0.22	0.11	0.14	0.20	
Amenities	0.11	0.08	0.10	0.15	0.09	
Services Integrat.	0.23	0.21	0.22	0.11	0.21	
Information	0.16	0.14	0.17	0.11	0.14	
Waiting	0.13	0.11	0.13	0.25	0.13	
Facility Design	0.15	0.13	0.16	0.14	0.12	
Transfers Type	Bus↔Bus					
Case Study	Bangalore			Delhi NCT		
Group	Male	Female	Overall	Male	Female	Overall
Comfort	0.16	0.16	0.21	0.15	0.14	0.17
Safety	--	0.23	0.21	0.15	0.20	0.09
Amenities	--	0.23	--	0.12	0.09	0.12
Services	0.27	0.16	0.19	0.29	0.30	0.32
Fare	0.20	--	0.09	0.10	0.13	0.13
Waiting	--	--	0.16	--	--	--
Facility Design	0.37	0.23	0.16	0.19	0.14	0.16

RESULTS

- **Reliability and Safety:** This Component plays an **important role for increasing the satisfaction of user**. Reliability and Safety has the 10x higher impact on user satisfaction than compared to any other component.
- **Integration:** The presence of limited travel card charging counters at metro station and limited stop of renewing monthly pass for bus users remain major contributor of increasing transfer penalties.
- **Amenities:** Availability of such amenities represent not just the physical presence of facilities at station, but it also demands proper functionalities of it.
- **Comfort and Waiting:** Comfort and Waiting are influenced by the public transport services as the attributes are less important for metro users and most important for Bus user and have 20% impact on satisfaction and need to be improved for Bus Service.
- **Accessibility:** This component is influenced/derived by the type of mode and may require extra efforts for improvement as this can be affected due to absence of external features such as pedestrian walkways, access/egress mode and distance, etc.
- **Route Information:** Since such facilities is available at both transfer levels, the attribute has least importance for all passenger group and thus have least impact on Satisfaction.

CONCLUSION

- All the attributes and variable are important for public transport users
- This study shows that **Passenger are more satisfied with physically integrated transport system** (Rajiv Chowk Metro Station). This is due to more reliable and safety/secure services at Metro station.
- Satisfaction study in Delhi also confirms the Hierarchy of user's needs identified by Van Hagen (1961), **as Reliability and Safety are the two most important factor that influences the satisfaction** of user and also have significant impact of user satisfaction as observed from SEM analysis
- This also indicates the **need for improving Bus services in Delhi** with high priority **as User are highly dissatisfied with Reliability and Security** for using Bus as Public Transport Mode.
- Taking learnings from TBP and Prestons (2008), **improvement in Bus services** is essential to have significant impact on Public Transport system **as Both Metro and Bus user are least satisfied with the Comfort** as shown in ISA
- Observations from I-S Analysis states that **all user groups are least satisfied with Access to station** (Ease of reaching station') and **transfers between two modes** (Short Distance between station) in the study. This confirms the need of integrated public transport system in Delhi with improved out vehicle time.
- As observed from SEM analysis, **Integration also has significant impact on Public Transport users satisfaction.**

THANK YOU

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