

Investigating Style Satisfaction in Online Fashion Apparel Shopping Across Generations using Multigroup Structural Equation Modeling: A Comprehensive Study

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ABSTRACT

Online shopping has emerged as a widely adopted activity on the internet, demonstrating substantial growth in recent years, albeit not yet realizing its full potential. The internet has provided new opportunities for organizations to effectively engage with both current and potential customers. Websites play a crucial role in facilitating customers to seamlessly explore, compare, and conduct online purchases of various products and services, with a notable emphasis on fashion apparel.

This study aims to identify the diverse factors influencing customer satisfaction with online shopping for fashion apparel across different age groups. Utilizing a Likert Scale format with five options (SA= strongly agree 5, A= agree 4, U= undecided 3, D= disagree 2, SD= strongly disagree 1), the questionnaire comprises two sections. The first section captures demographic information, while the second delves into four factors through 21 questions. Conducted via Google Forms, distributed through email and WhatsApp, the survey targeted respondents aged 18 and above, mentally sound, engaged in online shopping, and residing in Purba Midnapore. Employing stratified random sampling, the population was segmented into smaller groups. Out of 700 collected responses, 60 were discarded due to incomplete information, resulting in a dataset of 640.

Factor analysis, facilitated by SPSS21 (IBM Corporation), was employed to identify constructs. Confirmatory factor analysis, conducted using AMOS 20 (IBM Corporation), further elucidated the variables and their alignment within specific factors. Four factors—perceived quality, perceived benefit, perceived price, and perceived safety—were identified for each age group. In summary, the model has achieved a commendable level of goodness of fit.

Keywords: Online shopping, customer satisfaction, fashion apparel, age groups, demographic information, factor analysis, confirmatory factor analysis, perceived quality, perceived benefit, perceived price, perceived safety.

INTRODUCTION

In today's interconnected world, the internet serves as a vast information source, influencing various aspects of life, including product details and health insights (Emanuel et al., 2014). The impact of e-commerce on the retail landscape has been significant, especially with technological advancements and the accelerated growth spurred by the COVID-19 pandemic (Amatulli et al., 2021). The thriving online market, marked by fierce competition, presents both challenges and opportunities (Herhausen et al., 2015). Traditional in-store shopping has evolved into digital experiences, allowing customers to make buying decisions from the comfort of their homes (Oh, 2022). The younger generation exhibits dynamic shopping behaviors, engaging in activities such as information gathering, locating nearby stores, and placing orders, commonly referred to as "web rooming" (Scarpi et al., 2014). This shift underscores the impact of both online and offline channels on customer satisfaction (Arora and Sahney, 2017).

Chiu, Chen, Tzeng, and Shyu (2006) underscore the importance of traditional marketing strategy in decision-making and identifying factors influencing customer behavior. A robust marketing strategy is essential for an institution's survival, hinging on product specifics, customer behavior, and effective communication.

Customer satisfaction, shaped by both online and offline shopping experiences, becomes a pivotal factor in the evolving market landscape (Huang et al., 2020). Adapting strategies to accommodate the dynamics of both online and offline stores presents a challenge for marketers, as noted by Zhang et al. (2021) (Sarkar et al., 2021). In fashion apparel shopping, customers seek more than functional utility; they express their cultural identity and habits globally (Hirschman and Holbrook, 1982: 92-93). Emotions play a crucial role in the shopping experience, with customers balancing emotional and practical considerations (Michon et al., 2007: 490). In the era of increasing e-shopping, customer satisfaction emerges as a critical element influencing repeat purchases and brand trust (Solimun and Fernandes, 2018). Companies dedicate efforts to understand customer preferences and expectations, aligning with customer satisfaction as the focal point (Shankar et al., 2003). This proactive approach unravels the ever-evolving challenges posed by customer reactions and preferences (Chauhan et al., 2021). Today's consumers, especially the youth, have the option to engage in both traditional retailing and e-shopping, contributing unique dimensions to their satisfaction parameters (Dhanapal, Vashu, and Subramaniam, 2015).

LITERATURE REVIEW:

Tzeng et al. (2021) underscore the pivotal factors that drive the selection of online services, including product information, service details, and assistance related to pricing. The convenience associated with returning and replacing products further enhances the attractiveness of online shopping (Rao, 1999). In the realm of e-marketing, brands actively cater to customer preferences by providing an array of choices and prioritizing user-friendly interfaces (Vaskelainen and Piscitelli, 2018). The domain of fashion apparel stands out as a lucrative segment in e-marketing, where visual merchandising significantly boosts customer engagement (Zhang et al., 2000; Tractinsky and Rao, 2001). Price, recognized as a decisive factor, influences customers in choosing between online and offline shopping, with elements such as discount offers and product variety playing pivotal roles (Ratchford et al., 2001; Zeithaml, 2002). The e-retail industry has undergone significant transformations with the rise of the internet, carving out a distinct virtual market space. Notably, the Telecom Regulatory Authority of India reported a surge in internet users from 164.81 million in 2012-13 to 445.96 million in 2017. Projections from IBEF.org (2017) anticipate substantial growth in India's e-commerce marketplace, projecting it to reach up to 188 billion by 2025.

Rani (2014) posits that consumer purchasing behavior is significantly influenced by psychological and socio-demographic characteristics, such as age, annual income, economic conditions, occupation, and personal lifestyle. These individual attributes contribute to the uniqueness of each person, shaping their distinct characteristics. Numerous research studies confirm that social, cultural, personal, and psychological traits directly impact marketing strategies (Sukdeo, 2018). The marketing process begins by addressing the needs, wants, and desires of consumers, ultimately culminating in the satisfaction of these elements to achieve companies' objectives (Dumaz, 2014).

Age emerges as a pivotal demographic factor exerting a profound impact on consumer purchasing behavior. According to Rani (2014), age plays a crucial role in shaping consumer choices and consumption habits, thereby influencing marketing strategy.

Kearney (2016) envisions a continual increase in online shoppers, particularly among the younger generation. Raman (2017) notes a heightened inclination for online shopping among females, particularly those under 30, driven by their preference for discounts. Distinct shopping behaviors emerge between genders and age groups, shaping the landscape of online shopping (Chen et al., 2016). In the Indian context, limited research has delved into the impact of gender and age on online shopping preferences (Baubonienė and Gulevičiūtė, 2015). Age-related influences on online buying behavior become evident, with younger consumers demonstrating strong objectives and preferences for online shopping, while older consumers encounter more obstacles (Gong, Stump, and Maddox, 2013; Lian and Yen, 2014). However, once individuals experience online shopping, the significance of age, gender, and income factors diminishes (Mathew, 2015). Dhanapal, Vashu, and Subramaniam (2015) emphasize challenges related to transactions and deliveries across all age groups. The availability of products round the clock, along with the ability to compare different sellers, emerges as a pivotal driver for online shopping (Hernández Jiménez and José Martín, 2011). Factors such as family members viewing products simultaneously, website user-friendliness, transaction safety, product descriptions, minimum purchase restrictions for free delivery, location-specific delivery availability, and potential delays in deliveries collectively contribute to shaping the online shopping experience across age groups.

METHODOLOGY

After an extensive review of diverse literature, we have identified four key factors influencing customer satisfaction: Perceived Benefits, Perceived Quality, Perceived Price, and Perceived Safety. These factors encompass various variables, including three for Perceived Benefits, five for Perceived Quality, five for Perceived Price, and four for Perceived Safety. The factors are given below:

(Factor)	Description	Variables
PERCEIVED BENEFITS(PB)	The costs of the items I purchased online are reasonable and within my means	PB1
	I buy things online because I can do it whenever I want	PB2
	Online shopping saves time	PB3
PERCEIVED SAFETY(PS)	I am concerned about the actual price of the product because there might be hidden costs such as shipping cost, delivery cost	PS1
	It is very difficult to understand the product quality, colour, and size	PS2
	I am concerned about the time delayed in delivery, return, refund and replacement.	PS3
	Saving credit card/net banking detailed information to online shopping site is unsafe	PS4
	There is a risk of receiving a wrong product in online shopping	PS5
PERCEIVED QUALITY(PQ)	I am sure about the quality information of product and its quality is true	PQ1
	Online shopping provides quality product and service	PQ2
	I am sure about post purchases assistance such as customer care service, easy return policy	PQ3
	I am concerned about to get authentic and original product from the site	PQ4
	Actual expectations and perceived expectations satisfy all time?	PQ5
PERCEIVED PRICE (PP)	Online shopping would provide me with price comparison	PP1
	Online shopping offers discounts, buy one get one, coupon and free shipping facilities.	PP2
	Price charged by online seller is fair enough	PP3
	Refund policy is smooth enough	PP4
CUSTOMER SATISFACTION(CS)	I am Happy with the entire return and refund policy.	SAT1
	Feel like my bank details, card details are safe.	SAT2
	Comparisons of product, price and brand is very easy.	SAT3
	Get verity of colours, styles and brand as compared to traditional shop	SAT4

We formulated a closed-ended questionnaire using a Likert scale with five choices (SA=strongly agree 5, A=agree 4, U=undecided 3, D=disagree 2, SD=strongly disagree 1). The questionnaire is divided into two parts, with the first section gathering demographic information and the second containing twenty-one closed-ended questions covering the four factors. Each questionnaire includes instructions and the study's purpose at the top. The survey targeted mentally sound respondents above 18 years old in Purba Midnapore, and the Google Form was distributed via email and WhatsApp. Stratified random sampling was employed to categorize the population into small groups or strata. A total of 700 responses were collected, and after removing 60 incomplete datasets, 640 remained.

We utilized SPSS 21 and AMOS for Confirmatory Factor Analysis (CFA) and Multi-Group Factor Analysis in our study. CFA was conducted to assess four latent variables: perceived benefit, perceived safety, perceived quality,

perceived price. Reliability measures including Cronbach's alpha, composite reliability (CR), and average variance extracted (AVE) were computed to evaluate the questionnaire's reliability. Discriminant validity was examined using AVE, and convergent validity was assessed using the square root of AVE. Our approach to Multi-Group Structural Equation Modelling involved two key steps: Measurement Model Invariance and Structural Model Invariance. We initiated the process by establishing configural invariance to compare the measurement model with an unconstrained model across groups, demonstrating the data's invariance. Subsequently, metric invariance was examined to ascertain if the indicators measured consistently across groups, revealing insignificant measurement weights and confirming metric invariance. Moving to the structural invariance, the goodness of fit for unconstrained and constrained models was assessed, with both models meeting the cutoff criteria for CFI, TLI, ρ^2 , IFI $\Delta 2$, RFI rho 1, NFI $\Delta 1$, and RMSEA. The evaluation of structural invariance involved scrutinizing the difference in chi-square values and various fit indices, including CFI, TLI, ρ^2 , IFI $\Delta 2$, RFI rho 1, NFI $\Delta 1$, and RMSEA. Significance in these results would imply significant differences between groups. Standardized path coefficients were examined to understand the influence of one variable on another, and path coefficients were considered to test hypotheses. In summary, our multi-group structural equation modelling encompassed measurement invariance and structural invariance analyses.

3.1 Research frame work and hypothesis testing

Various studies highlight disparities, and researchers express diverse opinions regarding the connection between customer satisfaction across different age groups and several influencing factors such as perceived benefit, perceived quality, perceived safety, and perceived price. A multitude of perspectives exists among researchers concerning the correlation between customer satisfaction and buying intention. It is crucial to comprehend these associations thoroughly, necessitating the formulation of comprehensive hypotheses that encompass various aspects. Drawing from the literature review, the following hypotheses can be established:

H₁ There is a significant influence of age on the relationship between Perceived Benefits and customer satisfaction.

H_a Age does not have a significant impact on the relationship between Perceived Benefits and customer satisfaction.

H₂ There is a significant influence of age on the relationship between Perceived Safety and customer satisfaction.

H_a Age does not have a significant impact on the relationship between Perceived Safety and customer satisfaction.

H₃ There is a significant influence of age on the relationship between Perceived Quality and customer satisfaction.

H_a Age does not have a significant impact on the relationship between Perceived Quality and customer satisfaction.

H₄ There is a significant influence of age on the relationship between Perceived Price and customer satisfaction.

H_a Age does not have a significant impact on the relationship between Perceived Price and customer satisfaction.

3.3 Descriptive study

Descriptive characteristics of respondents were examined using SPSS 21. From an initial dataset of 700 responses, 60 entries were excluded due to incomplete information, resulting in a refined dataset of 640. Subsequently, we conducted factor analysis using SPSS 21 (IBM Corporation) to unravel the underlying constructs within the data. To further validate and refine the factor structure, Confirmatory Factor Analysis (CFA) was performed using AMOS 20 (IBM Corporation) software. Through this analysis, we identified distinct factors wherein various items demonstrated significant loadings. Specifically, the first factor exhibited loading for three items, the second factor for five items, the third factor for four items, and the fourth factor for five items.

	Bellow 20		20-30		30-40		40-50		Above 50	
Items	Skewn ess	Kurt osis	Skewn ess	Kurt osis	Skewn ess	Kurt osis	Skewn ess	Kurt osis	Skewn ess	Kurt osis
PERCEIVED BENEFITS										
The costs of the items I purchased online are reasonable and within my means	-1.121	1.442	-1.720	4.142	-1.112	1.235	-1.651	3.755	-1.149	1.210
I buy things online because I can do it whenever I want	-1.252	1.979	-1.782	4.461	-1.191	1.616	-1.729	4.314	-1.252	1.655
Online shopping saves time	-1.104	1.504	-1.687	4.146	-1.056	1.175	-1.546	3.516	-1.126	1.293
PERCEIVED SAFETY										
I am concerned about the actual price of the product because there might be hidden costs such as shipping cost, delivery cost	-0.676	-0.352	-0.796	-0.690	-0.526	-0.805	-0.849	-0.334	-0.706	-0.079
It is very difficult to understand the product	-0.667	-0.288	-0.772	-0.715	-0.506	-0.776	-0.828	-0.354	-0.719	0.037

quality, colour, and size										
I am concerned about the time delayed in delivery, return, refund and replacement.	-0.624	-.152	-.723	-.760	-.440	-.723	-.828	-.354	-.736	.316
Saving credit card/net banking detailed information to online shopping site is unsafe	-0.72	-.129	-.846	-.635	-.540	-.707	-.958	-.213	-.772	.260
There is a risk of receiving a wrong product in online shopping	-0.643	-.151	-.747	-.738	-.440	-.723	-.870	-.314	-.747	.295
Perceived quality										
I am sure about the quality information of product and its quality is true	-0.754	-.501	-.850	.624	-.799	-.498	-1.045	.562	-.854	-.239
Online shopping provides quality product and service	-0.733	-.577	-.922	.762	-.775	-.577	-1.035	.446	-.868	-.273
I am sure about post purchases	-0.779	-.556	-.878	.826	-.802	-.592	-1.017	.455	-.886	-.298

assistance such as customer care service, easy return policy										
I am concerned about to get authentic and original product from the site	-0.769	-.497	-.899	.790	-.807	-.528	-1.031	.685	-.891	-.242
Actual expectations and perceived expectations satisfy all time?	-0.742	-.337	-.852	1.184	-.768	-.399	-.983	.688	-.908	.096
Perceived price										
Online shopping would provide me with price comparison	-.719	2.861	-.732	1.491	-.709	2.932	-.813	1.764	-1.038	1.678
Online shopping offers discounts , buy one get one, coupon and free shipping facilities.	-.758	2.614	-.781	1.274	-.751	2.614	-.891	1.771	-1.014	1.651
Price charged by online seller is fair enough	-.743	2.444	-.749	1.392	-.738	2.448	-.827	1.542	-.977	1.512
Refund policy is smooth enough	-.639	.799	-.656	.278	-.658	.815	-.667	.354	-.785	.535

Customer Satisfaction										
I am Happy with the entire return and refund policy.	-0.311	-0.692	-0.269	-0.686	-0.329	-0.710	-0.314	-0.658	-0.352	-0.677
Feel like my bank details, card details are safe.	-0.319	-0.678	-0.269	-0.686	-0.338	-0.694	-0.359	-0.671	-0.331	-0.661
Comparisons of product, price and brand is very easy.	-0.260	-0.640	-0.251	-0.731	-0.281	-0.661	-0.289	-0.654	-0.277	-0.643
Get verity of colours, styles and brand as compared to traditional shop	-0.299	-0.667	-0.251	-0.731	-0.318	-0.685	-0.313	-0.661	-0.327	-0.668

The presented table displays the Skewness and Kurtosis values for all items within each factor, organized into five segments corresponding to different age groups. The indicated values of skewness and kurtosis fall within the range of +2 to -2 for both segments, in accordance with the criteria for normal distribution (Bryman et al., 2011; Nunnally et al., 1994).

The measurement model (confirmatory factor analysis)

Age 1(Below 20)								Age 2 (20-30)						
Factor	Variable	Loading	PB	PQ	PS	PP	SAT	Factor	Loading	PB	PQ	PS	PP	SAT
Perceived Benefit	PB1	0.995	0.987					Perceived Benefit	0.994	.986				
	PB2	0.985							0.994					
	PB3	0.979							0.975					
AVE								0.975						
CR								0.991						
Sq.AVE														
									0.987					

Sq.AVE 0.9863 Cronbach's alpha .990								Cronbach's alpha .992								
Perceived Quality AVE 0.933 CR 0.985 Sq. AVE 0.9663 Cronbach's alpha .986	PQ1	0.957	.0061	.965				Perceived Quality AVE 0.932 CR 0.989 Sq. AVE 0.965 Cronbach's alpha .988	0.963	.215*	.966					
	PQ2	0.952							0.958							
	PQ3	0.99							0.982							
	PQ4	0.975							0.963							
	PQ5	0.995							0.944							
Perceived Safety AVE 0.934 CR 0.988 Sq. AVE 0.966 Cronbach's alpha .987	PS1	0.958	.245**	0.063	.971			Perceived Safety AVE 0.942 CR 0.9765 577 Sq. AVE 0.984 Cronbach's alpha .986	0.972	.481**	.330**					
	PS2	0.97							0.979							
	PS3	0.997							0.995							
	PS4	0.977							0.992							
	PS5	0.93							0.915							
Perceived Price AVE 0.9050 CR 0.971 Sq.AVE 0.951 Cronbach's alpha .970	PP1	0.945	.127**	0.172	-0.033	.967		Perceived Price AVE 0.935 CR 0.981 Sq.AVE 0.967 Cronbach's alpha .982	0.972	.332**	.226**					
	PP2	0.969							0.983							
	PP3	0.99							0.99							
	PP4	0.899							0.922						.131	.950
Satisfaction	SAT1	0.983	.300**	.239**	.267**	.327**	.975	Satisfaction	0.988	.403**	.304**	.394**	.292**	.975		
	SAT2	0.971							0.988							
	SAT3	0.959							0.939							

AVE 0.952 CR 0.993 Sq.AVE 0.976 Cronbach's alpha .987	SAT4	0.991						AVE 0.952 CR 0.980 Sq.AVE 0.975 Cronbach's alpha .989	0.988					
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Age 3(30-40)								Age 4(40-50)						
Factor	Variable	Loading	PB	PQ	PS	PP	SAT	Factor	Loading	PB	PQ	PS	PP	SAT
Perceived Benefit AVE 0.972 CR 0.990 Sq.AVE 0.986 Cronbach's alpha .992	PB1	0.995	0.986					Perceived Benefit AVE 0.972 CR 0.990 Sq.AVE 0.986 Cronbach's alpha .988	0.995	.986				
	PB2	0.985							0.985					
	PB3	0.979							0.979					
Perceived Quality AVE 0.943 CR 0.990 Sq. AVE 0.971 Cronbach's alpha .991	PQ1	0.957	.235**					Perceived Quality AVE 0.940 CR 0.989 Sq. AVE 0.969 Cronbach's alpha .986	0.956	.107	0.969			
	PQ2	0.952							0.952					
	PQ3	0.99							0.99					
	PQ4	0.975							0.975					
	PQ5	0.995							0.955					
Perceived Safety AVE 0.933	PS1	0.957	.363**	.210*	0.966			Perceived Safety AVE 0.932	0.962	.274**	.214*	.969		
	PS2	0.969											0.974	
	PS3	0.997											0.997	
	PS4	0.977											0.977	
	PS5	0.955											0.937	

CR 0.966 Sq. AVE 0.985 Cronba ch's alpha .985								CR 0.984 Sq. AVE 0.965 Cronba ch's alpha .991						
Perceiv ed Price AVE 0.904 CR 0.971 Sq.AV E 0.950 Cornba ch's alpha .968	PP1	0.944	.210 *	.114	- 0.0 01	.95 1		Perceiv ed Price AVE 0.910 CR 0.973 Sq.AV E 0.954 Cornba ch's alpha .976	0.953	.18 0*	.07 5	.00 9	.95 4	
	PP2	0.969							0.972					
	PP3	0.989							0.991					
	PP4								0.899					
Satisfa ction AVE 0.950 CR 0.975 Sq.AV E 0.992 Cronba ch's alpha .988	SAT 1	0.982	.33 8**	.27 9**	.32 8**	.25 4**	0.9 76	Satisfa ction AVE 0.951 CR 0.993 Sq.AV E 0.975 Cronba ch's alpha .990	0.982	.33 6**	.22 4*	.30 6**	.30 4**	.9 75
	SAT2	0.97							0.972					
	SAT3	0.958							0.958					
	SAT4								0.99					

Age 5 (Above 50)							
Factor	Variable	Loading	PB	PQ	PS	PP	SAT
Perceived Benefit AVE 0.972 CR 0.990 Sq.AVE 0.986	PB1	0.995	0.986				
	PB2	0.985					
	PB3	0.979					
Cronbach's alpha .992							
Perceived Quality	PQ1	0.959	.022	.968			

AVE 0.907 CR 0.981 Sq. AVE 0.952 Cronbach's alpha .990	PQ2	0.955					
	PQ3	0.99					
	PQ4	0.977					
	PQ 5	0.955					
Perceived Safety AVE 0.937 CR 0.985 Sq. AVE 0.968 Cronbach's alpha .989	PS1	0.958	.508**	.094	.952		
	PS2	0.975					
	PS3	0.991					
	PS4	0.899					
	PS5	0.937					
Perceived Price AVE 0.910 CR 0.973 Sq.AVE 0.954 Cornbach's alpha .980	PP1	0.953	-0.095	-0.128	-.247**	.954	
	PP2	0.972					
	PP3	0.991					
	PP4	0.899					
Satisfaction AVE 0.952 CR 0.975 Sq.AVE 0.993 Cronbach's alpha .998	SAT 1	0.983	.389**	.096	.303**	.023	.975
	SAT2	0.97					
	SAT3	0.959					
	SAT4	0.991					

AVE: Average Variance Extracted

CR: Composite Reliability

Alpha: Cronbach's Alpha

** Significant correlation at the .001 level (Two-Tailed)

* Significant correlation at the .05 level (Two-Tailed)

The assessment of our model's fit involved multiple indices, including the Comparative Fit Index (CFI), normed chi-square, Tucker-Lewis Index (TLI), and Root Mean Square Error of Approximation (RMSEA), following established recommendations from scholars such as Hair et al. (2017), Bryman and Cramer (2011), Nunnally (1994), Fornell and Larcker (1981), Anderson and Gerbing (1988), and Kline (2015). The results affirm the model's adherence to the Goodness of Fit (GoF) criteria. The chi-square value (CMIN) stands at 2167.617 with 968 degrees of freedom and a p-value < 0.001, resulting in a CMIN/df ratio of 2.239, falling within the suggested range of 2 to 5 (Marsh & Hocevar, 1985). Additionally, the CFI is 0.959, TLI is 0.956, IFI is 0.959, RFI is 0.923, and NFI is 0.929, all surpassing the recommended threshold of 0.90 (Gerpott et al., 2001). The RMSEA value of 0.044 falls within the accepted range of 0.05 to 0.08 (Hair et al., 2007), further affirming the model's goodness of fit. For the reliability analysis, which involved Cronbach's alpha and the Composite Reliability (CR) index, all factors within both age groups demonstrated reliability, surpassing the 0.70 cutoff for Cronbach's alpha (Charter et al., 2000), and meeting the 0.70 criterion for CR (Brennen et al., 2020). **Convergent validity** was verified by examining factor loadings and Average Variance Extracted (AVE) values. Factor loadings for all factors in both groups exceeded the 0.50 threshold (Hair et al., 2006). AVE values for each factor also surpassed the 0.50 minimum cutoff, providing additional support for convergent validity (Brennen et al., 2020). **Discriminant validity** was established using the Fornell-Larcker Criterion, where the square root of AVE for each construct exceeded the correlation between that construct and any other. The presented table illustrates that the square roots of AVE for all factors are higher than the latent variable correlations, confirming the model's reliability, convergent validity, and discriminant validity (Jorg et al., 2015).

Measurement Invariance

Measurement invariance is essential for ensuring that the measurement model remains consistent across different age groups. To assess this, the first step involved performing configural invariance to compare the unconstrained model across groups. The goodness of fit analysis revealed that the data is invariant, with CFI, TLI ρ_2 , IFI Δ_2 , RFI rho 1, and NFI Δ_1 all indicating values of 0.960, 0.959, 0.960, 0.926, and 0.927, respectively. Additionally, the RMSEA is 0.042, and the CMIN/df value is 2.140, confirming the invariance.

The second step focused on conducting metric invariance to assess whether the indicators measure the same constructs across the groups. The comparison of the model resulted in a p-value of 0.990, signifying insignificance. Therefore, we can conclude that measurement weights are insignificant across the groups, indicating no significant differences in measurement weights. Consequently, we have successfully achieved metric invariance.

Model	DF	CMIN	P	NFI Delta-1	IFI Delta-2	RFI rho-1	TLI rho2
Measurement weights	64	40.680	.990	.001	.001	-.003	-.004

STRUCTURED MODEL (UNCONSTRAINT)

The evaluation of the Structural Model initiated with an extensive literature review, guiding the development of our conceptual model. Subsequently, data collection was conducted to assess the congruence between our conceptual and theoretical models, following the methodology outlined by Anderson in 1988. To gauge the model's Goodness of Fit, a set of indices, including CFI, TLI ρ_2 , IFI Δ_2 , RFI rho 1, NFI Δ_1 , and RMSEA, were employed. The CMIN value stands at 1161.834 with degrees of freedom (df) at 383, resulting in a CMIN/df ratio of 3.034. Individually, the values for CFI, TLI ρ_2 , IFI Δ_2 , RFI rho 1, NFI Δ_1 , and RMSEA are 0.973, 0.970, 0.973, 0.957, 0.960, and 0.056, respectively. Together, these values signify the achievement of a commendable level of Goodness of Fit (GoF) for our structural model. Test of the structured model showing below :

Age group (bellow 20)				
Path	Estimate	S.E.	C.R.	P
Satisfaction - Perceived Benefit	.124	.062	1.997	.046
Satisfaction - Perceived safety	.195	.075	2.607	.009
Satisfaction - Perceived quality	.132	.052	2.509	.012
Satisfaction - Perceived price	.224	.080	2.817	.005
Age group (20-30)				
Satisfaction - Perceived Benefit	.149	.061	2.463	.014
Satisfaction - Perceived safety	.152	.069	2.208	.027
Satisfaction - Perceived quality	.160	.061	2.624	.009
Satisfaction - Perceived price	.251	.070	3.589	< 0.001
Age group (30-40)				
Satisfaction - Perceived Benefit	.158	.063	2.492	.013
Satisfaction - Perceived safety	.191	.078	2.444	.015
Satisfaction - Perceived quality	.108	.050	2.167	.030
Satisfaction - Perceived price	.186	.082	2.280	.023
Age group (40-50)				
Satisfaction - Perceived Benefit	.160	.065	2.467	.014
Satisfaction - Perceived safety	.139	.069	2.006	.045
Satisfaction - Perceived quality	.159	.062	2.548	.011
Satisfaction - Perceived price	.258	.075	3.439	< 0.001
Age group (above 50)				
Satisfaction - Perceived Benefit	.244	.067	3.641	< 0.001

Satisfaction - Perceived safety	.083	.072	1.161	.246
Satisfaction - Perceived quality	.054	.059	.916	.360
Satisfaction - Perceived price	.097	.078	1.241	.215

The depicted chart illustrates the four path coefficients across five age groups, presenting the results of the unconstrained model. These path coefficients correspond to the relationships between customer satisfaction and perceived benefit, perceived price, perceived safety, and perceived quality. The chart indicates that the influence of the four factors on customer satisfaction across different age groups is not statistically significant, as evidenced by p-values exceeding 0.05 in all cases.

Measurement structural invariance

The evaluation of structural invariance across two generations involved the comparison of two models: the unconstrained model and the constraint model. Both models, the unconstrained ($\chi^2 = 2168.454$, $df = 971$, $p < 0.001$, CFI = .959, TLI $\rho^2 = .956$ IFI $\Delta^2 = .959$ RFI rho 1 = .923, NFI $\Delta^1 = .929$, and RMSEA = .044) and the constraint model ($\chi^2 = 2175.036$, $df = 987$, $p < 0.001$, CFI = .960, TLI $\rho^2 = .957$ IFI $\Delta^2 = .960$ RFI rho 1 = .924, NFI $\Delta^1 = .928$, and RMSEA = .052), exhibit a satisfactory fit.

However, the χ^2 difference test resulted in a significant outcome with a p-value of .001, surpassing the 0.05 threshold. This indicates noteworthy differences in the path coefficients between the two age groups, suggesting that the structural relationships between latent variables vary across generations.

Multi group Comparison

To assess multi-group analysis, we conducted a comparative examination of four path coefficients across five distinct age groups. Our investigation aimed to determine the significance of differences in these coefficients through pairwise comparisons. Interestingly, while the path coefficients within each age group exhibited generally insignificant variations, facilitating conditions stood out as the exception, displaying notable differences.

Path	Age 1 Beta coefficient	Age 2 Beta coefficient	Age 3 Beta coefficient	Age 4 Beta coefficient	Age 5 Beta coefficient	P value difference of age group	Status of Hypothesis
Perceived benefit - sat	.170	.202	.217	.214	.343	.755	Rejected
Perceived safety -sat	.214	.178	.211	.148	.094	.822	Rejected
Perceived quality -sat	.208	.213	.173	.245	.088	.700	Rejected
Perceived price -sat	.233	.292	.195	.262	.104	.567	Rejected

The chart provided illustrates model comparisons, indicating that the four differences in path coefficients are statistically non-significant among employees of different age groups. The p-values associated with the distinctions in path coefficients for perceived benefits (pb), perceived safety (ps), perceived quality (pq), and perceived price (pp) are .755, .822, .700, and .567, respectively, all exceeding the significance threshold. Consequently, there is insufficient evidence to suggest a significant variation in the impact of perceived risk on behavioral intention among employees of different age groups.

DISCUSSION

The passage presented details the outcomes of an investigation that examined four hypotheses concerning the impact of age on the associations between various perceived factors (benefits, safety, quality, and price) and customer satisfaction. Let's delve into the findings and provide a detailed explanation for each hypothesis:

1. **Perceived Benefits and Customer Satisfaction:**

- Hypothesis: "There is a significant influence of age on the relationship between Perceived Benefits and customer satisfaction."

- Result: The study rejected the null hypothesis and accepted the alternative hypothesis, indicating that there is no significant influence of age on the relationship between perceived benefits and customer satisfaction.

- Comparison with Previous Research: The study contrasts with the findings of Simcock, P., Sudbury, L., & Wright, G. (2006), who reported different results. It's noteworthy that research outcomes in this area may vary.

2. **Perceived Safety and Customer Satisfaction:**

- Hypothesis: "There is a significant influence of age on the relationship between Perceived Safety and customer satisfaction."

- Result: The study rejected the null hypothesis and accepted the alternative hypothesis, suggesting that age does not have a significant impact on the relationship between perceived safety and customer satisfaction.

- Comparison with Previous Research: The result aligns with the findings of Deng, Z., Lu, Y., Wei, K. K., & Zhang, J. (2010).

3. **Perceived Quality and Customer Satisfaction:**

- Hypothesis: "There is a significant influence of age on the relationship between Perceived Quality and customer satisfaction."

- Result: The study rejected the null hypothesis, indicating that age does not have a significant impact on the relationship between perceived quality and customer satisfaction.

- Comparison with Previous Research: Similar results were found in the research by Hu, H. H., Kandampully, J., & Juwaheer, T. D. (2009).

4. **Perceived Price and Customer Satisfaction:**

- Hypothesis: "There is a significant influence of age on the relationship between Perceived Price and customer satisfaction."

- Result: The study rejected the null hypothesis, suggesting that age does not have a significant impact on the relationship between perceived price and customer satisfaction.

- Comparison with Previous Research: Roth, S., & Bösener, K. (2015) and Cakici, A. C., Akgunduz, Y., & Yildirim, O. (2019) also showed similar results.

In summary, the study concludes that age does not significantly influence the relationship between perceived benefits, safety, quality, price, and customer satisfaction. These findings are consistent with some prior research and differ from others, highlighting the complexity and context-dependency of these relationships in the literature. Researchers should consider the nuances and variations across studies when interpreting and applying these results.

CONCLUSION

In conclusion, our investigation delving into the impact of age on perceived factors and customer satisfaction in online shopping reveals nuanced relationships. Contrary to expectations, age does not significantly shape the connection between perceived benefits, safety, quality, price, and customer satisfaction. Our findings challenge prior research in highlighting the complexity of age-related influences in the online shopping context. The study suggests that perceived safety and quality are universal factors, relatively unaffected by age, aligning with previous research. Additionally, the rejection of the null hypothesis concerning perceived price emphasizes the universal appeal of this factor across age groups. These insights underscore the variability in results across studies and emphasize the importance of considering the dynamic nature of consumer behaviors and contextual factors in shaping online shopping experiences. As the online retail landscape continues to evolve, these findings provide valuable considerations for practitioners and researchers in tailoring effective strategies and interventions.

REFERENCES

- [1] Amatulli, C., De Angelis, M., Sestino, A., & Guido, G. (2021). Omnichannel Shopping Experiences for Fast Fashion and Luxury Brands: An Exploratory Study. In *Developing Successful Global Strategies for Marketing Luxury Brands* (22-43). IGI Global
- [2] Anderson, J.C.; Gerbing, D.W. Structural Equation Modeling in Practice: A Review and Recommended Two-Step Approach. *Psychol. Bull.* **1988**, *103*, 411–423. [CrossRef]
- [3] Arora, S. & Sahney, S. (2017). Webrooming behaviour: a conceptual framework, *International Journal of Retail & Distribution Management*, *45* (7/8), 762-781.
- [4] Bryman, A. (2011). Research methods in the study of leadership. *The SAGE handbook of leadership*, 15-28.

- [5] Cakici, A. C., Akgunduz, Y., & Yildirim, O. (2019). The impact of perceived price justice and satisfaction on loyalty: the mediating effect of revisit intention. *Tourism Review*, 74(3), 443-462.
- [6] Charter, E. (2000). The earth charter. Retrieved March, 1, 2008.
- [7] Chauhan, S., Banerjee, R., Mittal, M., & Singh, H. (2021). Performance Analysis of Online Shopping For Customer Satisfaction Using PLS-SEM. In 2021 10th IEEE International Conference on Communication Systems and Network Technologies (CSNT) 876-880. IEEE.
- [8] Chen, H., Phelan, K. V., & Jai, T. M. (2016). Gender differences in deal hunting: what motivates consumers to search and book hotel deals? *Journal of Hospitality Marketing & Management*, 25(5), 613- 639.
- [9] Chen, H., Phelan, K. V., & Jai, T. M. (2016). Gender differences in deal hunting: what motivates consumers to search and book hotel deals? *Journal of Hospitality Marketing & Management*, 25(5), 613-639.
- [10] Chiu, Y. J., Chen, H. C., Tzeng, G. H., & Shyu, J. Z. (2006). Marketing strategy based on customer behaviour for the LCD-TV. *International journal of management and decision making*, 7(2-3), 143-165.
- [11] De Vellis, R.F., (1991), Scale Development: Theory and Applications, Sage Publications, Newbury Park, CA.
- [12] Dhanapal, S., Vashu, D., & Subramaniam, T. (2015). Perceptions on the challenges of online purchasing: a study from “baby boomers”, generation “X” and generation “Y” point of views. *Contaduría y Administración*, 60, 107- 132.
- [13] Deng, Z., Lu, Y., Wei, K. K., & Zhang, J. (2010). Understanding customer satisfaction and loyalty: An empirical study of mobile instant messages in China. *International journal of information management*, 30(4), 289-300.
- [14] Dhanapal, S., Vashu, D., & Subramaniam, T. (2015). Perceptions on the challenges of online purchasing: a study from “baby boomers”, generation “X” and generation “Y” point of views. *Contaduría y administración*, 60, 107-132.
- [15] Dhar, R. and Wertenbroch, K. (2000). Consumer Choice between Hedonic and Utilitarian Goods, *Journal of Marketing Research*, 37 (February), 60–71.
- [16] Discount pricing. Baubonienė, Z., & Gulevičiūtė, G. (2015). E-commerce factors influencing consumers' online shopping decision. *Social Technologies*, 5(1), 74-81.
- [17] Durmaz, Y. (2014). The impact of psychological factors on consumer buying behavior and an empirical application in Turkey.
- [18] Emanuel, L., Neil, G. J., Bevan, C., Fraser, D. S., Stevenage, S. V., Whitty, M. T., & Jamison-Powell, S. (2014). Who am I? Representing the self-offline and in different online contexts. *Computers in Human Behavior*, 41, 146-152
- [19] Fornell, C.; Larcker, D.F. Structural Equation Models with Unobservable Variables and Measurement Error: Algebra and Statistics. *J. Mark. Res.* **1981**, 18, 382–388. [CrossRef]
- [20] Gerpott, T. J., Rams, W., & Schindler, A. (2001). Customer retention, loyalty, and satisfaction in the German mobile cellular telecommunications market. *Telecommunications policy*, 25(4), 249-269.
- [21] Gilly, M. C., & Zeithaml, V. A. (1985). The elderly consumer and adoption of technologies. *Journal of consumer research*, 12(3), 353- 357.
- [22] Haghshenas, L., Abedi, A., Ghorbani, E., Kamali, A., & Harooni, M. (2013). Review consumer behavior and factors affecting on purchasing decisions. *Singaporean Journal of Business, Economics and Management Studies*, 1(10), 17-24.
- [23] Hair, J.F.; Matthews, L.M.; Matthews, R.L.; Sarstedt, M. PLS-SEM or CB-SEM: Updated Guidelines on Which Method to Use. *Int. J. Multivar. Data Anal.* **2017**, 1, 107–123. [CrossRef]
- [24] Hamidi, H., & Moradi, S. (2017). Analysis of consideration of security parameters by vendors on trust and customer satisfaction in e-commerce. *Journal of Global Information Management (JGIM)*, 25(4), 32-45.
- [25] Herhausen, D., Binder, J., Schoegel, M., & Herrmann, A. (2015). Integrating bricks with clicks: retailer-level and channel-level outcomes of online–offline channel integration. *Journal of retailing*, 91(2), 309-325.
- [26] Hernández, B., Jiménez, J., & José Martín, M. (2011). Age, gender and income: do they really moderate online shopping behaviour?. *Online information review*, 35(1), 113-133.
- [27] Hirschman, E. C. and Holbrook, M. B. (1982). Hedonic consumption: Emerging concepts, methods and propositions. *Journal of Marketing*, 46(Summer), 92–101.

- [27] Hu, H. H., Kandampully, J., & Juwaheer, T. D. (2009). Relationships and impacts of service quality, perceived value, customer satisfaction, and image: an empirical study. *The service industries journal*, 29(2), 111-125.
- [28] Huang, C.-C., Chang, Y.-W., Hsu, P.Y. & Prassida, G.F. (2020). A cross-country investigation of customer transactions from online to offline channels, *Industrial Management & Data Systems*, 120 (12), 2397-2422
- [29] IBEF.org. (2017). E-commerce November report, <https://www.ibef.org/industry/ecommerce.aspx> (viewed on 23/12/2107).
- [30] Kearney,A.T.(2016).Digital retail in 2020:Rewriting the rules, A Google-A.T. Kearney study, viewed on 23/12/2017. <https://www.atkearney.in/documents/4773014/8192273/Digital+Retail+in+2020%E2%80%93Rewriting+the+Rules.pdf/392551c2-7b43-4666-938e-2168a6bd7f6d>
- [31] Kearney,A.T.(2016).Digital retail in 2020:Rewriting the rules, A Google-A.T. Kearney study, viewed on 23/12/2017. <https://www.atkearney.in/documents/4773014/8192273/Digital+Retail+in+2020%E2%80%93Rewriting+the+Rules.pdf/392551c2-7b43-4666-938e-2168a6bd7f6d>
- [32] Kim, J., & Lee, J. (2002). Critical design factors for successful e-commerce systems. *Behaviour & Information Technology*, 21(3), 185–199.
- [33] Kline, R.B. *Principles and Practice of Structural Equation Modeling*; Guilford Publications: New York, NY, USA, 2015.
- [34] Lachman, M. L., & Brett, D. L. (2013). *Generation Y: Shopping and entertainment in the digital age*. Urban Land Institute.
- [35] Mashao, E. T., & Sukdeo, N. (2018, July). Factors that influence consumer behavior in the purchase of durable household products. In *Proceedings of the International Conference on Industrial Engineering and Operations Management* (pp. 26-27).
- [36] Michon, R., Yu, H., Smith D., Chebat, J. C. (2007). The Shopping Experience of Female Fashion Leaders, *International Journal of Retail & Distribution Management*, 35 (6), 488 – 501
- [37] Nunnally, J.; Bernstein, I. *Psychometric Theory*; McGraw Hill: New York, NY, USA, 1994.
- [38] Oh, C. H. (2022). Examining effectiveness of online and offline channel integration, *Journal of Business & Industrial Marketing*, 37 (1), 255-240.
- [39] Online Discounts vs. Free Shipping: A Battle of the Ages. (2014). Retrieved from <https://www.emarketer.com/Article/OnlineDiscounts-vs-Free-Shipping-Battle-of-Ages/1011219> (viewed on15/8/2018)
- [40] Online Discounts vs. Free Shipping: A Battle of the Ages. (2014). Retrieved from <https://www.emarketer.com/Article/Online-Discounts-vs-Free-Shipping-Battle-of-Ages/1011219> **(viewed on15/8/2018)**.
- [41] Phillips, L. W., & Sternthal, B. (1977). Age differences in information processing: a perspective on the aged consumer. *Journal of Marketing Research*, 444-457
- [42] Pinki, R. (2014). Factors influencing consumer behavior. *International Journal of Current Research in Academic Review*, 2(9), 52-61.
- [43] Raman, P. (2017). What Women Want? An Analysis of Demographics and Different Factors Influencing Online Shopping in India. *Journal of Business & Management*, 23.
- [44] Raman, P. (2017). What Women Want? An Analysis of Demographics and Different Factors Influencing Online Shopping in India. *Journal of Business & Management*, 23.
- [45] Rao, B. (1999). The Internet and the revolution in distribution: a cross-industry examination. *Technology in Society*, 21(3), 287-306
- [46] Ratchford, B. T., Talukdar, D., & Lee, M. S. (2001). A model of consumer choice of the Internet as an information source. *International Journal of Electronic Commerce*, 5(3), 7-21.
- [47] Roth, S., & Bösener, K. (2015). The influence of customer satisfaction on customer price behavior: literature review and identification of research gaps. *Management Review Quarterly*, 65, 1-33.
- [48] Sarkar, B., Dey, B.K., Sarkar, M. & AlArjani, A. (2021).A Sustainable Online-to-Offline (O2O) Retailing Strategy for a Supply Chain Management under Controllable Lead Time and Variable Demand. *Sustainability*, 13(4), 1756.
- [49] Scarpi, D., Pizzi, G. & Visentin, M. (2014). Shopping for fun or shopping to buy: is it different online and offline? *Journal of Retailing and Consumer Services*, 21(3), 258-267.

-
- [50] Shankar, V., Smith, A. K., & Rangaswamy, A. (2003). Customer satisfaction and loyalty in online and offline environments. *International journal of research in marketing*, 20(2), 153-175.
- [51] Simcock, P., Sudbury, L., & Wright, G. (2006). Age, perceived risk and satisfaction in consumer decision making: A review and extension. *Journal of Marketing Management*, 22(3-4), 355-377.
- [52] Solimun, S., & Fernandes, A. A. R. (2018). The mediation effect of customer satisfaction in the relationship between service quality, service orientation, and marketing mix strategy to customer loyalty. *Journal of Management Development*. 37 (1) 76-87
- [53] Telecom Regulatory Authority of India.(2013). The Indian Telecom Services Performance Indicators. Retrieved from <http://www.trai.gov.in/WriteReadData/PIRReport/Documents/Indicator%20Reports%20-01082013.pdf> (viewed on 25/9/2015)
- [54] Telecom Regulatory Authority of India.(2014). The Indian Telecom Services Performance Indicators. Retrieved from <http://www.trai.gov.in/WriteReadData/PIRReport/Documents/Indicator Reports - Mar-14.pdf> (viewed on 27/9/2015)
- [55] Telecom Regulatory Authority of India.(2015). The Indian Telecom Services Performance Indicators. Retrieved from <http://www.trai.gov.in/WriteReadData/WhatsNew/Documents/Indicator-Reports-Mar12082015.pdf> (viewed on 27/9/2015)
- [56] Tractinsky, N., & Rao, V. S. (2001). Social dimensions of internet shopping: theory-based arguments for webstore design. *Human Systems Management*, 20
- [57] Tzeng, S.Y., Ertz, M., Jo, M.S. & Sarigöllü, E. (2021). Factors affecting customer satisfaction on the online shopping holiday. *Marketing Intelligence & Planning*.
- [58] Zeithaml, V.A. (2002). Service excellent in electronic channels, *Managing Service Quality*, 12 (3), 135-13836.
- [59] Zhang, Ping & Gisela M. von Dran.(2000). Satisfiers and Dis-satisfiers: A Two-Factor Model for Web-site Design and Evaluation, *Journal of the American Society for Information Science*, 5(14), 1253–1268.
- [60] Zhang, Q., Cao, W., Liu, Y. & Zhang, Z. (2021). Integration of online and offline channels in retail: feasibility of BOPS?, *Kybernetes*, 50(5), 1588-1620.