



Article

Analysis of the Barriers to Widespread Adoption of Electric Vehicles in Shenzhen China

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Abstract: China promoted the large-scale adoption of Electric Vehicles (EVs) in its 13th five-year plan; however, this target faces many obstacles. This paper analyzes the main barriers to widespread adoption of EVs through a survey in Shenzhen, which has the biggest EVs market share out of China's major cities. Based on previous research, this paper conducted a new study using 406 approved questionnaires among 500 participants. Our study proposed five hypotheses to examine the main barriers to widespread adoption of EVs. The analysis was conducted using statistical method that included two-way frequency tables, chi-square test, and factor analysis. The results indicated that perception of advantages of EVs and access to recharging EVs remained the main barriers in large-scale penetration. Furthermore, our study revealed that a drop in financial incentives would not cause a significant decline in the future adoption of EVs. The study provides suggestions to car manufacturers and government policy advisors based on our analysis and discussion.

Keywords: EVs; PHEVs; penetration; adoption; barriers; preference; willingness; attitude

1. Introduction

Electric vehicles (EVs) are classified based on their fuel technologies, of which there are four types: plug-in hybrid electric vehicles (PHEVs), extended-range battery electric vehicles (E-REVs), battery electric vehicles (BEVs), and hybrid electric vehicles (HEVs) [1]. It has been proposed that EVs are a good solution for the problem of GHGs (greenhouse gases) caused by transportation and air pollutant emissions [2]. Most developed countries are carrying out a variety public policies and financial incentives for the large-scale adoption of EVs. In the existing literature, much research focused on the topics of consumer choice, recharging station placement, and the economic analysis of EV promotion [3–10]

Despite a broad consensus on the large-scale adoption of EVs in the world, its benefits and realization ultimately falls on the willingness of consumers to accept new technology. According to a survey conducted in 2008, 69% of US consumers have little or no familiarity with the technology of PHEVs [3]. A later research also showed that people could not accept premiums for the adoption of EVs [4]. To fully understand the behavior behind a consumer's choice, another survey was conducted in major US cities to examine the consumer's willingness and attitude towards plug-in electric cars. The results revealed that the overall ratio of the desire to buy or lease electric vehicles is small. However, interest in the PHEVs technology is greater than that of the EVs [5]. Furthermore, when considering

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range anxiety, a barrier to EVs adoption, several studies have inferred that people are not willing to choose EVs due to range anxiety and inconvenient recharging access [6].

Much of the previous literature in this area analyzed the consumer's opinion, desire and attitude toward EVs, and also examines other societal or psychological influences on the adoption of EVs [7]. The findings showed that attitudes, knowledge and perception related to EVs differ across gender, age, and education groups [7,8]. Furthermore, the previous study also suggested that the adoption of EVs were influenced by public policies, financial incentives, and energy price [9]. Additionally, many previous studies aimed at investigating pro-environmental lifestyle, technology oriented lifestyle and openness of to change. Another survey was conducted to explore the environment awareness of consumers, technology views, experiences and interest in EVs. The results indicated that sustainability and environmental benefits of EVs have a major influence on EVs adoption, and a major potential barriers to widespread EVs adoption is the uncertainty associated with the EVs battery technology and sustainability of fuel source. As we know, China is the second biggest market for car manufacturers in the world; however, there have been few studies on the penetration behavior and patterns of Chinese consumers with regard to electric cars. This study extends previous research by conducting a new survey in Shenzhen, China.

Since 2009, China has become the largest car producer and the second largest market consumer of passenger vehicles in the world. The demographic data published by the government shows that the market share of EVs in China has surpassed that of the US in terms of production and sales data issued online on 13 August 2015 [10]. Furthermore, it is well-known that Shenzhen is one of the most innovative cities and is an EVs demonstration town in China, which has played a significant contribution in their innovation and the openness of the global market. These factors make Shenzhen an excellent case study for studying the status of EV adoption and the buying behavior of consumers. Previous research also shows that there are significant differences that exist in the values and decision-making process between Western and Chinese people [11,12]. Other results have indicated that in The Netherlands, consumers pay high attention to value and safety. The French favor design, style, and fashion in car advertisements [13], while German and Italian consumers share similar characteristics with the French in preferring fast, advanced technology, and smart, multifunctional vehicles. In contrast, Americans consider cars as a symbol of status and seek big, powerful vehicles [13]. Moreover, a new interview study was conducted in US, which examined the consumer purchasing behavior, acceptance and barriers toward PHEVs [14,15]. However, the evidence was still unclear as to how Chinese consumers felt regarding EVs.

This study conducted a survey among the residents of Shenzhen residents. Participants had to have at least 3–10 years of driving experience and were acutely aware of cars and urban transportation conditions. Furthermore, at least one-third of respondents had to have experience driving EVs. The survey focused on the participant's preference for EVs, as well as their willingness and attitudes towards these vehicles.

The remainder of the paper is as follows: Section 2 describes the materials and methods, Section 3 states data quality controls, Section 4 presents the main results of this survey and our discussion of them, and Section 5 states our conclusions.

2. Material and Methods

This paper examined the consumer consumption behavior of Chinese people towards EVs through a questionnaire undertaken in the city of Shenzhen. Based on the literature reviewed in the introduction, previous research revealed barriers to widespread adoption of EVs. Furthermore, earlier findings showed that cross-cultural differences influenced the purchasing intent of consumers towards vehicles. Another Chinese research also revealed that product branding significantly affected the buying intent of consumers for vehicles other than company brands [16]. Hence, this paper proposed five hypotheses and tried to confirm it by analysis.

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hypotheses# 1: The participants showed more preference for EVs with a local brand and elegant style; hypotheses# 2: The participants' attitude toward EVs depends on the perception of the advantages of EV technology compared with in combustion engine vehicles (ICEVs);

hypotheses# 3: The buying willingness of participants depends on the access to recharging EVs;

hypotheses# 4: The high price of EVs is a critical barrier in purchasing willingness; and

hypotheses# 5: Consumer purchasing willingness will decrease if financial subsidies drop significantly.

To examine these hypotheses, a survey conducted among the residents of Shenzhen will assist in developing new energy products such as EVs, PHEVs, and solar powered products. BYD (brand name of one China EVs manufacturer)—a well-known EV producer in China—has a diverse range of EVs selling across the global market. BYD's EV products cover electric passenger cars, electric buses and electrical engineering vehicles such as the BYD K9, electronic van T5, and electric truck T7. Furthermore, the total miles of EVs running in Shenzhen has already achieved 150 million kilometers, with at least 1000 electric taxis, and 3000 electric buses operating in Shenzhen over the past three years [17]. Hence, Shenzhen residents have a shorter distance to close EVs. Although Shenzhen has a population of 1,178,900, the registered population was 3,549,900 from the Shenzhen government's published data. Most of the other residents came from different provinces of China. Thus, this study chose to target only Shenzhen residents , which was considered to be representative of the normal status, instead of a particular case.

The study collected survey data among Shenzhen residents including drivers experienced with EVs, EV consumers, or residents familiar with EVs. This research recruited participants and expressed the value of the study and their contribution by website. Each participant received RMB100 as a bonus, with a total of 500 questionnaires distributed. In total, there were 406 usable cases with a response rate of 81.2%.

The study used statistical methods including: two-way frequency tables, chi-square, the Fisher's test, and factor analysis to examine the differences between the causes and consumer willingness. In the chi-square and Fisher's test, the study used a standard 5% or 0.05 cut-off for defining the significant difference. An associated *p*-value less than 0.05 showed significant differences. Furthermore, the study also conducted a factor analysis to explore the relationship between the causes and dependent variables using IBM SPSS software. The following sections present the survey and statistical result based on these methods.

3. Data and Control

Some questionnaires were discarded if participants did not respond in the survey. Furthermore, a preliminary test showed that the questionnaire needed at least 10 min to complete. The mean value of the time spent on completing the questionnaire was 17 min, and four questionnaires were removed due to a time of less than 3 min being spent on answering the questions. There were 52 questions in the survey which set up with multiple choice answers (e.g., not at all, a little, somewhat, a lot). Additionally, for statistical analysis answer choices were scored depending on the degree ("not at all" = 1, "a little" = 2, "somewhat" = 3, "a lot" = 4).

The survey was categorized into four sections: (1) basic information such as age, gender, income, education, occupation, driving experiences, home ownership and travel pattern; (2) preference for EVs, and the EV characteristics pursued by consumers; (3) purchasing willingness and attitude toward EVs such as the present consumer's real willingness and attitude toward EVs; and (4) public policy and financial incentives which represent the main public policy and financial incentives currently established in China.

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4. Results

4.1. Sample Description and Basic Information

The research aim was to examine the willingness of consumers to buy EVs and their attitudes towards them to reveal the main barriers to their widespread adoption in China. Furthermore, these results could be used as a basis for public policy development in other cities in China.

The study collected 406 usable questionnaires, of which males respondents accounted for 76.4% of the whole population (n = 310), and 23.6% were females (n = 96). The age of the respondents was mainly concentrated between 22 and 35 years old bracket and accounted for 53.4% of the whole population. Age group over 35 years old accounted for 45.5% and ranked second , and only 5 participants were less than 22 years old.

With regard to the occupation of the respondents, most of them were office workers (40.4%) of the total participants, with private firms owners ranked second, and senior management group third. A further 9.4% were research and design engineers, and the rest were university students. The overall sample population represents potential consumers of EVs and the demographic distribution is showed in Table 1.

	Male	76.40%
Gender	Female	23.60%
	18–22 Years old	1.20%
	22–35 Years old	53.40%
Age	Over 35 Years old	45.30%
-	Office worker	40.40%
	Senior Manager	21.20%
	Private Firm Owner	24.40%
Occupation	University Student	4.70%
	Research & Design Engineer	9.40%
	Less than 3 years	31.50%
Drive Evnerience	Between 3–5 years	15.00%
Drive Experience	Between 5-8years	19.70%
	Over 8 years	33.70%
	Less than \$8000	18.00%
Annual Income	\$8000–15,000	33.50%
Ailituai ilicollie	\$15,000-50,000	35.70%
	Over \$50,000	12.80%
	Owned Apartment	54.20%
Home Ownership	Rent Room	30.80%
Tionic Ownership	Dormitory	11.30%
	Others	3.70%
	Owned Private Car	55.70%
Travel Pattern	Company Scheduled Bus	6.20%
Havel I attern	Public Bus or Metro	26.60%
	Others	11.60%

Table 1. Sample Description.

The survey also summarized the respondents' driving experiences, income level, home ownership and trip patterns. Most respondents owned private cars and apartments. According to annual income, more than 50% of respondents were of the middle or even the middle high classes in China. Furthermore, one-third of survey respondents had previous driving experiences with EVs or PHEVs.

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4.2. The Preference for EVs

Based on statistical analysis (Figure 1), 59.3% (n = 242) of respondents favored Chinese EV brands, 17.9% (n = 73) preferred Germany brands, 15.9% (n = 65) of respondents aspired to American brands, and the last 6.9% (n = 28) preferred Japanese brands. Furthermore, the Fisher's test results (p-value = 0.007) revealed significant differences between gender and consumers' preference for EV brands in Table 2. Males expressed greater interest in Chinese EV brands, while females preferred Germany brands. A subsequent Fisher's test (p-value = 0.004) revealed that 68.3% of office workers and 65.8% of Research and Design (R&D) engineers also preferred Chinese brands. Similarly, private firm owner and senior management preferred Chinese brands and accounted for 57.6% and 47.6% respectively. When asked about car style, males showed a higher preference for sport utility vehicle (SUV) PHEVs than females, and females showed more interest in hatchback cars than men.

Factors	Pearson Chi-Square Sig.	Fisher's Exact Test Sig.
Occupation	0.004	0.004
Gender	0.013	0.007

Table 2. Fisher test between factors and brand preference.

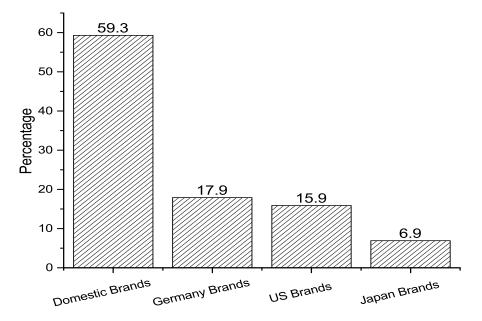


Figure 1. Brand Preference Analysis Demographic.

As seen in Figure 2, 55.7% of participants had private cars, and 68.4% (n = 279) had driving experiences with EVs. The Fisher tests (p-value = 0.029) showed little differences between gender and EVs experience in Table 3; however, males showed more experiences than females. There were no other significant differences between driving experience and factors such as age (p-value = 0.654), income level (p-value = 0.318), occupation (p-value = 0.135), home ownership (p-value = 0.214) and region (p-value = 0.463). However, there were significant differences between driving experience and perception of EVs (p-value = 0.006).

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Factors	Pearson Chi-Square Sig.	Fisher's Exact Test Sig.
Gender	0.039	0.029
Perception of EVs	0.008	0.006
Age	0.582	0.643
Income level	0.321	0.317
Occupation	0.132	0.135
Home Ownership	0.224	0.214

0.07

0.07

Table 3. Fisher test between variables and electric vehicles (EVs) driving experiences.

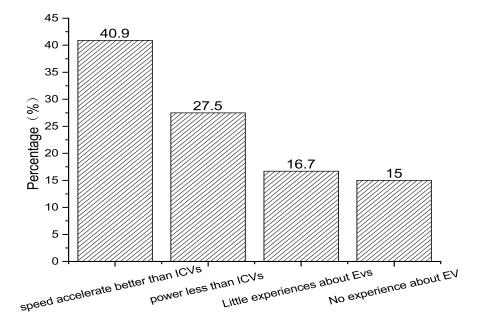


Figure 2. EVs Driving Experiences.

The study also analyzed the primary factors by SPSS, and the results are shown in Tables 4–6 and Figure 3. The research inferred the common items presented in Table 6 and offered common factors with an absolute value greater than 0.5 sorted below:

- I. **Environment awareness and energy security**: Respondents have high awareness of environment protection.
- II. Private car demand: Consumers desire to buy car for transportation need
- III. EVs Operation cost: Consumers monthly travel cost.

Origion

- IV. EVs Characteristics: Low operation cost, zero exhaust emissions, status symbol, etc.
- V. **Daily travel mileage**: Consumers daily travel mileage.

To further examine the associations between consumer preference and the specific factors, the study conducted a regression by SPSS (Statistical Products and Service Solutions). The regression residual distribution test (Figure 3) showed the regression equation was valid.

Table 4. Factor analysis test of purchasing preference.

KMO(Kaiser-Meyer-Olkin) and Bartlett's Test			
KM0 Measure of Sampling Adequacy 0.684			
Approx. Chi-Square	578.781 105 0.000		
	ling Adequacy Approx. Chi-Square		

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	Component				
	1	2	3	4	5
Q9	0.534	0.006	0.122	0.037	0.379
Q10	-0.127	0.398	0.047	0.467	0.100
Q11	0.169	0.179	0.555	-0.155	0.287
Q12	0.053	-0.082	-0.612	0.228	0.416
Q13	0.022	0.020	0.083	0.017	-0.790
Q14	0.003	-0.058	0.720	0.210	-0.091
Q15	-0.154	-0.192	-0.119	0.610	0.073
Q16	0.703	0.119	0.030	-0.027	-0.021
Q17	0.751	0.106	0.063	0.041	-0.032
Q18	0.294	0.579	0.103	0.082	0.232
Q19	0.536	0.240	-0.104	-0.016	-0.038
Q20	0.139	0.151	0.201	0.594	-0.011
Q21	0.137	0.661	-0.078	-0.142	-0.167
Q22	0.162	0.748	0.118	0.090	-0.025
Q23	0.244	-0.039	-0.335	0.531	-0.237

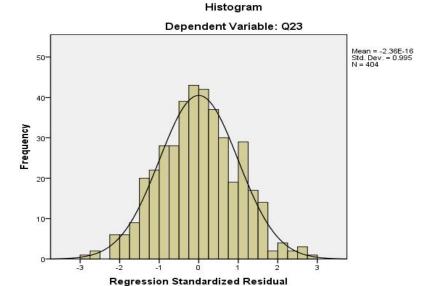


Figure 3. Regression residual distribution

 Table 6. Regression Coefficients.

Model	Unstandardized Coefficients		Standardized Coefficients		S:~	Collinearity Statistics	
Model	В	Std. Error	Beta	t Sig.		Tolerance	VIF
(Constant)	2.364	0.030		77.536	0.000		
factor 1	0.212	0.031	0.244	6.958	0.000	1.000	1.000
factor 3	-0.291	0.031	-0.335	-9.549	0.000	1.000	1.000
factor 4	0.462	0.031	0.531	15.147	0.000	1.000	1.000
factor 5	-0.206	0.031	-0.237	-6.752	0.000	1.000	1.000

Table 6 shows the results of regression performed by SPSS and is explained by the equation as below:

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4.3. Consumers Purchasing Willingness and Attitude

With regard to purchasing willingness for EVs, the study also examined the response of first-time car buyers. Figure 4 showed that 41.7% (n = 170) of respondents who wished to buy EVs considered the convenient recharging stations, 36% (n = 147) expressed strong interests in EVs due to their advantages. Furthermore, it examined the willingness of buyers for EVs as the second car, which revealed that 54.9% (n = 224) (Figure 5) had more willingness than before, and 31.6% (n = 129) had the desire to buy EVs as the second car. Thus, there was an 8.8% (n = 129) increase in the willingness of participants compared to the first-time. However, further analysis showed significant differences between occupation (p-value = 0.025), income level (p-value = 0.021) and buying desire. It revealed that office workers had more desire to buy EVs than others as did middle-income level respondents. Additionally, the survey showed that if the respondent had a private car and driving experiences, he or she was more likely to buy EVs than others.

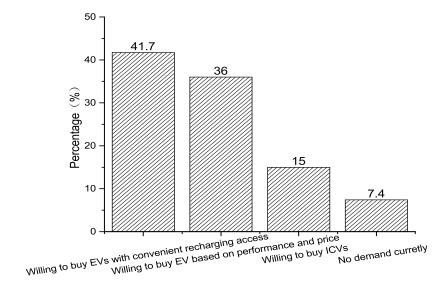


Figure 4. Willingness of the First time car buyer.

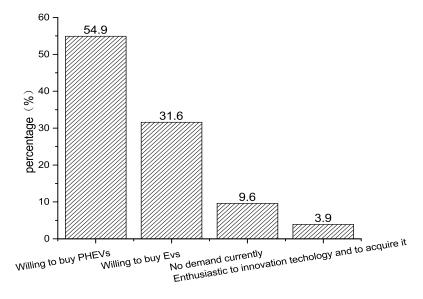


Figure 5. Willingness of The Second time Car Buyer.

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Furthermore, our research inferred that social circle, public policy, and energy security concern influenced the consumer willingness, which is shown in Figure 6 and Table 7. The analysis revealed that 29.9% (n = 122) of consumers were willing to change their minds based on a friend's opinion, and 27.9% were willing to change their minds based on a family member's opinion. When considering energy security concern, 46.3% (n = 189) expressed a strong desire to buy EVs now, 30.6% (n = 125) had the desire to buy EVs in the future, and 16.7% (n = 68) members expressed somewhat of a desire to buy EVs. Overall, the total percentage of consumers' willingness increased to 93.6% (n = 382).

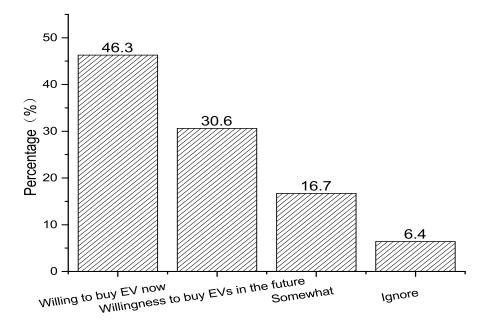


Figure 6. Willingness to buy EVs considering national energy safety.

lable 7. Association test for	willingness to buy EVs.
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Factors	Pearson Chi-Square Sig.	Fisher's Exact Test Sig.
Occupation	0.043	0.025
Income level	0.014	0.025
Society network members	0	0.001
ICVs technology improve	0	0
Attitude toward Evs	0.001	0.001

Regardless of the growth in fuel saving technology, or a significant drop in the future cost of fossil fuels, the respondents still demonstrated a strong desire to buy EVs, with percentages of 75.8% and 80.7%, respectively (Figure 7). With rising fuel prices, the intent to buy EVs will significantly increase.

Many experts have suggested that EVs are a good choice for environmental conservation and energy security; however, consumer attitudes were critical of large-scale penetration of EVs. The study showed that 47.1% (n = 192) members were undecided toward EVs, and 46.1% (n = 188) aspired to own an EV (Figure 8). Furthermore, 5.4% (n = 22) members were enthusiastic about EVs, and only 1.5% were against EVs. The Fisher's tests showed significant differences between participant attitudes and willingness as shown in Table 7 (p-value = 0.001), which means that a greater positive attitude toward EVs, leads to a stronger desire to buy these types of vehicles.

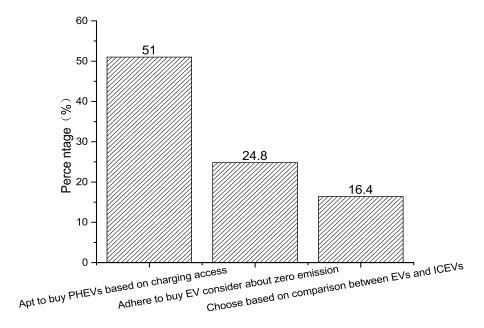


Figure 7. Purchasing willingness based on ICEVs technology Improvement.

On large-scale penetration, the study showed that most members (46.8%) held a positive opinion toward EVs (Figure 9) and 38.2% members believed that EVs would be mainstream in future.

The study also conducted the factor analyze to explore the main elements in this section by SPSS. The results are shown in Tables 8-10:

Table 8. kMO(Kaiser-Meyer-Olkin) and Bartlett's Test.

KMO Measure of Sam	0.771	
Bartlett's Test of Sphericity	Approx. Chi-Square df	1420.388 153
	Sig.	0.000

Table 9. Rotated component matrixa.

		C	ompone	nt	
	1	2	3	4	5
Q24	0.628				
Q25			0.935		
Q26			0.926		
Q27					0.788
Q28					
Q29					
Q30					
Q31	0.554				
Q32	0.526				
Q33		0.532			
Q34		0.678			
Q35		0.636			
Q36					
Q37	0.603				
Q38				0.815	
Q39				0.804	
Q40					
Q41	0.680				

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Table	10.	Regression	coefficients.

Model	Unstandardized Coefficients		Standardized Coefficients	+	Sig.	Collinearity Statistics	
	В	Std. Error	Beta		oig.	Tolerance	VIF
(Constant)	2.446	0.023		106.930	0.000		
factor score 1	0.390	0.023	0.628	17.011	0.000	1.000	1.000
factor score 2 factor score 4	0.127 0.073	0.023 0.023	0.205 0.118	5.558 3.197	$0.000 \\ 0.001$	1.000 1.000	1.000 1.000

Dependent Variable: Attitudes toward EVs.

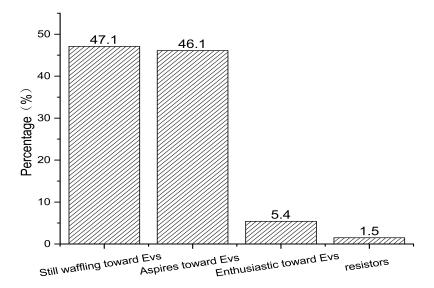


Figure 8. The participants attitudes toward EVs.

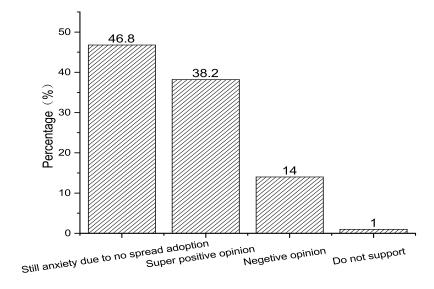


Figure 9. The Participants insights of spread adoption of EVs in future.

The KMO (Kaiser-Meyer-Olkin) test of factor analysis carried out by SPSS is presented in Table 8, and a KMO value greater than 0.5 implied that the original data was suitable for factor analysis. The total variances of all components accounted for 51.76%, which explained the variable very well. The study extracted the common elements and divided them into five groups by SPSS (Table 10):

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- I. **Perception of EVs**: Feeling or sense about EVs based on experiences and knowledge.
- II. EVs competitiveness: EVs exceptional performance comparing with ICEVs or other fuel vehicles
- III. EVs prices: EVs market price.
- IV. EVs full-charge range: Duration mileage of EVs with fully battery charge.
- V. **EVs operation cost**: Operation cost within life cycle period.

Additionally, the study carried regression by SPSS based on the common factors and the results are shown in Figures 10 and 11, and Tables 9–11. The regression equations were presented as below:

The attitude toward EVs =
$$2.446 + 0.390 \times Perception of EVs + 0.127 \times EVs competitiveness + 0.073 \times EVs full-charge range.$$
 (2)

and

Buying willingness of EVs =
$$1.944 + 0.259 \times \text{Perception}$$
 of EVs + $0.670 \times \text{EVs}$ competitiveness +0.182 × EVs prices - $0.182 \times \text{EVs}$ operation cost. (3)

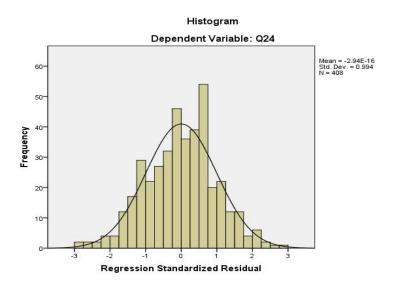


Figure 10. The regression standard residual of attitude toward EVs.

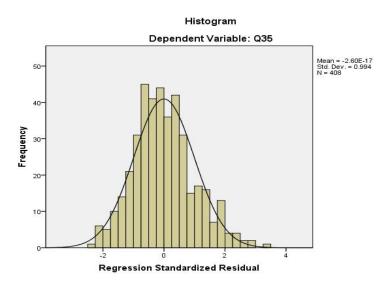


Figure 11. The regression standard residual of purchasing willingness to EVs.

Tah	lο	11	Regre	CCION	COST	ticien	te
IUV		11.	INCEIC		COCI	11C1C11	·co·

Model	Unstandardized Coefficients		Standardized Coefficients		Sig.	Collinearity Statistics	
Wiodei	В	Std. Error	Beta	t Sig		Tolerance	VIF
(Constant)	1.944	0.036		53.732	0.000		
factor 1	0.259	0.036	0.245	7.140	0.000	1.000	1.000
factor 2	0.670	0.036	0.636	18.487	0.000	1.000	1.000
factor 3	0.182	0.036	0.172	5.016	0.000	1.000	1.000
factor 5	-0.182	0.036	-0.173	-5.023	0.000	1.000	1.000

Dependent Variable: Purchasing willingness.

4.4. Public Policy and Price Incentive

In order to encourage consumers to adopt EVs, the government introduced a series of public policies and financial subsidies to stimulate the large-scale penetration of EVs with grants supported by the Chinese government presented in Tables 12 and 13. This study compared buying willingness as well as between financial subsidies support at current and a potential drop in the future in Figures 12–14. The analysis showed that 65.7% of respondents had the desire to buy EVs based on financial subsidies, and 63.9% also had the desire to buy PHEVs based on the grant. However, if the government canceled or reduced the subsidies by 2020, buying desire would drop but not significantly. Figure 14 shows that 45.6% of respondents would still consider buying EVs because of the technology trend and market share expectation. Thus, 22.3% would still buy EVs based on their attitudes toward EVs. Furthermore, a comparison of consumer willingness status and Chinese government published data showed that EVs (Figure 15) have increased robustly in the past three years.

Table 12. EVs price subsides in China.

Vehicle Type	Range with Pure Electricity Model						
vemere Type	$80 \text{ Km} \leqslant R \leqslant 150 \text{ Km}$	$150 \; Km \leqslant R \leqslant 250 \; Km$	$R \geq 250 \; Km$	$R \geq 50 \; Km$			
PEVs (2013) Unit: Ones PEVs (2014) Unit: Ones PHEVs (2013) Unit: Ones PHEVs (2014) Unit: Ones	\$5319.07 \$5319.07	\$7598.67 \$7598.67	\$9118.40 \$9118.40	N N \$5319.07 \$5319.07			

Table 13. EVs price subsides in Shenzhen.

Vehicle Type	Ra	ange with Pure Electricity	Model					
venicie Type	$80~\text{Km} \leqslant R \leqslant 150~\text{Km}$	$150~\text{Km} \leqslant R \leqslant 250~\text{Km}$	$R \geq 250 \; Km$	$R \geq 50 \; Km$				
PEVs (2013) Unit: Ones PEVs (2014) Unit: Ones PHEVs (2013) Unit: Ones PHEVs (2014) Unit: Ones	\$5319.07 \$5319.07	\$7598.67 \$7598.67	\$9118.40 \$9118.40	N N \$5319.07 \$5319.07				

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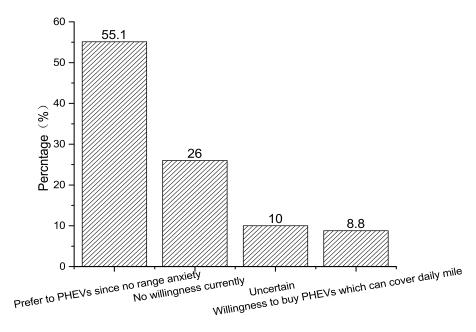


Figure 12. Plug-in hybrid electric vehicles (PHEVs) purchasing Willingness Based on Incentives.

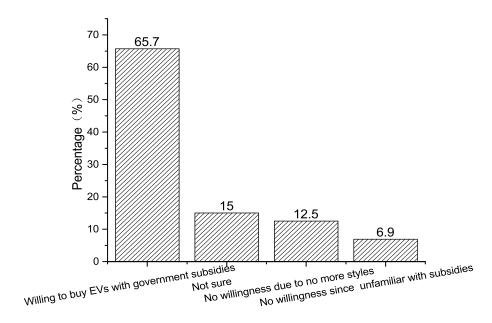


Figure 13. EVs Purchasing Willingness Based on Inventives.

Regarding the EVs price premium, this study examined the acceptance degree of the price of EVs by the residents of Shenzhen. The results showed that 50% (n = 204) of the respondents expected price range was between 13,071 and 24,509 US dollars. In addition, 37.3% (n = 152) of the respondents price expectation range was between 24,509 to 40,849 US dollars. A further 10.3% (n = 42) of participants had a price expectation range between 40,849 to 65,359 US dollars, and only 2.5% would accept a price range above 65,359 US dollars. Consumer acceptance of PHEVs prices had a similar statistical result to that of the EVs.

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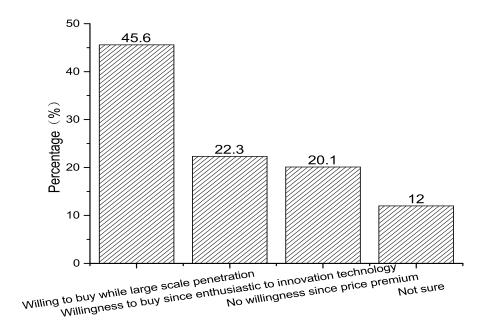


Figure 14. Willingness Changed When Subsides Canceled by 2020.

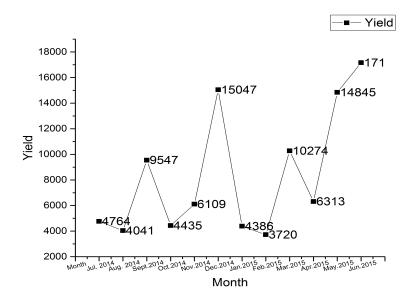


Figure 15. Passengers EVs Yield Past Years.

An examination of the sale price of EVs in the Chinese market showed a price range between 24,509 and 40,849 US dollars.

Furthermore, the study conducted the factors analysis and regression by SPSS. The KMO test inferred that the data was suitable for the factor analysis, and the results presented in Tables 14–16:

Table 14. KMO(Kaiser-Meyer-Olkin) and Bartlett's Test.

KMO Measure of Sam	0.818	
Bartlett's Test of Sphericity	Approx. Chi-Square df Sig.	839.176 66 0.000

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	Component						
	1	2	3				
Q42			0.566				
Q43		0.643					
Q44			0.663				
Q45	0.726						
Q46			0.550				
Q47	0.742						
Q48	0.733						
Q49	0.660						
Q50	0.677						
Q51		0.545					
Q52		0.620					
Q53		0.757					

Table 15. Rotated Component Matrix.

Table 16. Regression Coefficients.

Model	Unstandardized Coefficients		Standardized Coefficients	4	Sig.	Collinearity Statistics	
Wiodei	В	Std. Error	Beta	t 51g.	Tolerance	VIF	
(Constant)	1.429	0.029		48.634	0.000		
factor score 1	0.225	0.029	0.296	7.634	.000	1.000	1.000
factor score 3	0.417	0.029	0.550	14.174	0.000	1.000	1.000

Dependent Variable: Purchasing willingness.

The study extracted the Rotated components by SPSS and presented the common factors as below:

- I. Price subsidies
- II. **Public Policy Support**: Public policy supporting EVs operation conveniently.
- III. EVs Charge infrastructure placement: Recharge station placement for EVs spread adoption.

Additionally, the paper examined the relationship between common factors and the dependent variable by regression analysis using regression equation:

Buying willingness =
$$1.429 + 0.025 \times \text{public policy support} + 0.417 \times \text{EVs charge infrastructure deployment.}$$
 (4)

5. Discussion

5.1. Preference for EVs

This study only shows the results to support the Hypotheses #1 by basic statistical analysis and Fisher test. However, the regression inferred that consumer's real demand of private car fixes the preference for EVs. Thus, more research is required on potential users to evaluate their behaviors for the widespread adoption of EVs. Additionally, the results show that an awareness of environmental and national energy security has a significant influence on consumer's preference [18], which verifies that the public policy direction and environmental knowledge education from the central and local government of China is working. Furthermore, it is consistent with previous findings that an inverse proportional to the preference in regression analysis indicates that consumers also aim for lower using cost with EVs [19–21].

5.2. Consumers Purchasing Willingness and Attitude

Overall, the basic statistical analysis shows that participants have a strong willingness to adopt EVs regardless if they are first-time car buyer and optimistic about the prospective of widespread EVs

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adoption. However, the greatest concern surrounds the convenience of recharging stations and access. Although Chinese consumers express a strong will to buy EVs, to understand the primary factors that influence the buying decisions of consumers, more quantitative analysis needs to be undertaken. The study conducted regression, which showed that the perceptions, advantages and full-charge range of EVs fixed consumer attitudes towards these types of vehicles [22–24]. This also supports Hypotheses 2 and 3. Additionally, the perception item has a maximum regression coefficient, which means that it influences the attitude of consumers significantly.

The regression also revealed the factors that determined the buying willingness of consumers, which included perceptions, technology advantages, price and the cost of driving EVs [25,26], where the cost of driving EVs had an reversed relationship to buying willingness. All other coefficients were positive, and the advantages of EVs accounted for a higher percentage. Thus, it can be inferred that if customers have sufficient opportunity to experience EVs, their perceptions of EVs will rise significantly, and as will buying willingness [27]. Furthermore, considering the performance of EVs, if the advantages of EVs are better than those of ICEVs, it also increases consumer desire significantly. As explained by regression analysis, the price of EVs is not the primary influence on buying willingness. These results show differences to previous findings that suggested that price premium was a critical barrier to the adoption of EVs.

5.3. Public Policy and Price Incentive

This study implies that the central government price subsidies and local government subsidies public policy on EVs affects consumer buying willingness; however, factor analysis indicated that state strategic support and charging point placement are crucial elements to the widespread adoption of EVs adoption [28–32], and supports Hypotheses 3 and 4. However, our result rejects Hypothesis 5, and instead shows that a future drop in subsidies will not influence consumer buying willingness significantly.

This paper inherits the general structure of the formal research, with results verifying many of the conclusions from previous studies. Furthermore, it extends on the limitations of earlier studies which found that survey respondents had no driving experiences of EVs [33–39]. The contribution of this study is that most surveyed participants had direct experiences of driving EVs, thus reflects the real status of consumer behavior accurately. Additionally, the study proposed five hypotheses based on formal research findings and verified the assumptions using statistical analysis. These results are invaluable for car manufacturers and governments to identify potential market trends and adjust the EV industrial policies in China.

6. Conclusions

First, the study ascertained that participants had high willingness to buy EVs, which had limited support of the hypotheses. However, considering the widespread adoption of EVs, the uptake of EVs depends more on charging access placement in the community and working place, rather than public recharging stations [40–42]. Second, the research showed that consumer perception of EVs could be a significant barrier to its market penetration [43,44]; however, if consumers can obtain knowledge accurately and experience electric vehicles regularly, the attitudes and willingness toward these types of vehicles will increase significantly. Furthermore, it revealed that EV car manufacturers and governments should further promote the advantages related to EV technology. Additionally, with regard to recharging behavior, it is suggested that a majority of consumers prefer to charge at home at night, rather than recharging at their work place. The study also revealed that EV competitiveness, full-charge range, price, operational costs and public policy were crucial factors to the widespread use of electric vehicles, which supports our hypotheses. However, it also pointed out that a drop in financial incentives and the price premium of electric vehicles were not considered as barriers to their acceptance, which was verified by the analysis and limited the support of the hypotheses.

There were several drawbacks in current research: first, the survey population was limited so

the results may not be fully representative of the overall status. Second, future work in this area should improve the survey questionnaire and ensure its suitability for statistical analysis. Furthermore, the gender proportion should be more balanced than that in our study.

In conclusion, this study is valuable for electric vehicle car manufacturers in understanding Chinese consumer behavior regarding these types of cars. However, this study only focused on one region and the aim of future research is to conduct more comparative studies between Shenzhen and other Chinese cities regarding EV adoption. It would also be invaluable to conduct further research on the cultural differences using a global scope.

Supplementary Materials: The questionnaire mentioned in our study is available in the URL of http://www.lediaocha.com/pc/s/neutew.

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