

MDPI

Article

Passenger Acceptability of Teleoperation in Railways

Baris Cogan *D, Julia Tandetzki and Birgit Milius

Department of Land and Sea Transport Systems, Technische Universität Berlin, Straße des 17. Juni 135, 10623 Berlin, Germany

* Correspondence: baris.cogan@tu-berlin.de

Abstract: In this survey-based study, passenger awareness and acceptability of potential teleoperation services in the railway domain were analyzed. The literature on the important factors for the acceptability of automated transport was reviewed. These factors were adapted to teleoperation in the railway domain. An online survey was conducted for obtaining passengers' views on automated rail transport and the remote control of trains. A choice-based conjoint analysis was conducted to obtain user preferences regarding a potential teleoperation service. Overall, the teleoperation system and its capabilities received positive feedback. While increased resilience and reliability of rail services were identified as potential opportunities for higher acceptance, safety and security concerns of prospective passengers were highlighted as influencing factors.

Keywords: railways; remote operation; acceptability; conjoint analysis; passengers; teleoperation

1. Introduction

The growth in rail passengers and freight traffic demand is resulting in the need for improvements in existing railway operations. Automation systems such as those enabling Automatic Train Operation (ATO) are considered as a solution to this challenge. Driverless metros are already being implemented in various cities around the world. However, mainline passengers and freight operations bring different challenges due to being more prone to external disturbances. Remote control of trains can be a potential application to increase the resilience of railway operations. Remote operation (or teleoperation) allows for supervising and controlling automated trains and intervening remotely in case of disruptions. In the event of a failure, a remote operator can interact with the system remotely, communicate with other stakeholders—technical and human—and drive the train remotely.

Before developing and implementing such systems, the requirements and preferences of prospective users must be analyzed to avoid developing systems which are not acceptable. Acceptability and acceptance can be distinguished. The former refers to the potential judgement on acceptance before using the technology and the latter describes the judgement after using it [1]. Since teleoperation is currently not an alternative transport option in the railway domain, acceptability is the focus of the presented study.

The paper is structured as follows. Previous research on the acceptance of automated transport and the determinants of public acceptance are discussed on the basis of a literature review in Section 2. Section 3 describes the methodology of the analysis. In Section 4, the survey results of public opinion about automated rail transport and teleoperation are presented. Subsequently, the results of a choice-based conjoint analysis, which enable us to investigate future passengers' preferences for the identified attributes, are presented. Finally, the most important findings are discussed in Section 5 and concluding remarks are made in Section 6.



Citation: Cogan, B.; Tandetzki, J.; Milius, B. Passenger Acceptability of Teleoperation in Railways. *Future Transp.* 2022, 2, 956–969. https:// doi.org/10.3390/futuretransp2040053

Received: 18 October 2022 Accepted: 11 November 2022 Published: 18 November 2022

Publisher's Note: MDPI stays neutral with regard to jurisdictional claims in published maps and institutional affiliations.



Copyright: © 2022 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https://creativecommons.org/licenses/by/4.0/).

2. Previous Research

A considerable amount of research has been conducted on the acceptance of automated vehicles or automated transport systems. Most of these studies are concerned with driverless cars and road-bound public transport vehicles and shuttles. There are few studies in the area of autonomous rail transport, with research contributions for teleoperation being particularly sparse. In the railway domain there are several studies and demonstrations on teleoperation. These studies have investigated the use of different data transmission technologies [2], the interaction between the operator and assistance systems [3,4], the operational design of the teleoperation system [5,6], and safety and security risk analyses [7]. A pilot site in the Drive2theFuture project investigates user acceptance of teleoperation from the operator's perspective [8]. To our knowledge, there are no studies that investigate teleoperation in railways from the consumer perspective.

Considering rapidly increasing numbers of driverless systems, high awareness and acceptance levels of such systems are often reported in the literature. Various studies recorded high levels of interest in owning Level 4 Autonomous Vehicles (AV) [9], high levels of willingness to use autonomous public transport in the future [10], and high acceptance of unattended trains [11]. The latter study reported that autonomous rail-bound means of transport are preferred to autonomous non-rail-bound means of transport [10]. However, there are several important concerns and challenges regarding the safety and security of autonomous rail transport [12]. Besides several technical challenges, acceptance of unattended rail operation on the part of passengers is critical.

Another study identified several acceptance factors in two levels [13], micro-level and meso-level. Micro-level factors are individual difference factors such as sociodemographic factors, and meso-level factors are related to the exposure of individuals to AVs, domainspecific system evaluation, and social influence and moral aspects. Trust in automation technologies is a strong predictor of AV adoption [14]. Perceived risk is closely related to trust, safety, and security, and thus would affect people's acceptance of AVs [15]. A 2019 study reported that the presence and responsibilities of an onboard employee influence transit users' initial willingness to ride in driverless buses [16]. A passenger survey showed that the majority of respondents would prefer to see a driver or a driver cabin in a driverless train to help users adapt to new systems [17]. Service quality factors such as travel time, waiting time, and travel cost are important factors for the acceptance of automated transport services [18]. Prior experience with automated transport systems positively affects user acceptance [10] and feedback on security and safety [19]. Current technology awareness was shown to increase the interest in AV adoption and willingness-to-pay [9]. A wider list of determinants behind the acceptance of automated vehicles can be seen in the review of Becker and Axhause, 2017 [20].

Since teleoperation in railways is not yet an alternative within the transport sector, passenger choices cannot be observed yet. Therefore, stated choice-based analysis can be conducted to obtain user preferences regarding transportation services. Choice-based conjoint (CBC) analyses are widely used in many areas including transportation [21]. Alternatives within teleoperation can be defined by various attributes and the respective levels. Conclusions can be drawn about the importance of the individual attributes by systematically varying these factors in a repeated set of choices.

Maas, 2021 conducted a CBC analysis on various combinations of mobility services in Dresden by using attributes such as type of public transport passes and extent of use [22]. In another study, choice-based conjoint analysis was performed to understand travelers' preferences concerning a ridepooling system [23]. According to these results, fare was the most important service attribute, especially for younger participants. Consumer preferences for teleoperated robotaxis were investigated using choice-based conjoint analysis [24]. That analysis revealed that price was the most important attribute, followed by the possibility of intervention, pilot, and interior monitoring. Some of the attributes used in this study were adapted to rail transport and applied in the present study.

3. Materials and Methods

An online survey was created for the data collection with the use of identified factors that have the potential to influence passenger opinion. The survey was prepared in English and German. Survey questions aimed to encompass these factors for the driverless trains and teleoperation in railways.

The first part of the survey was concerned with autonomous rail transport in general. The respondents were queried regarding their views on the quality attributes of rail transport. Information regarding technology awareness and prior experience with automated vehicles was also collected. Questions on attitude and preference regarding driverless trains and automated operations were asked. The second part of the questionnaire included questions regarding teleoperation in railways. Factors that are important for the implementation of teleoperation were assessed by the participants. At the end of the questionnaire, sets of options were included for the choice-based analysis.

The respondents were informed about the proposed teleoperation system prior to the survey questions. The teleoperation service defined in the study was limited to the use case of a fallback system for driverless trains. According to this use case, railway operation runs in fully automated mode in regular operation. In cases of a system disruption where the train cannot continue the journey by itself, an operator in a remote-control center can intervene. Some examples of remote operator tasks are failure diagnosis, manual driving, and communication with passengers. For the choice-based questions, a scenario was defined for the purpose of informing the respondents about the operational situation. The scenario included a train journey with a duration of around two hours. A journey with the IC train between Berlin and Dresden was used as a reference.

Based on a literature review, five relevant attributes of the operational concept of teleoperation systems were determined (Table 1). For each attribute, two or more levels were identified. Several assumptions were employed when determining the attribute levels. Respondents were informed that part of the journey would be condicted by a remote driver. Assuming that the teleoperation takes place in cases of emergency for our scenario, the maximum duration between the stations in the reference ride was 30 min. Therefore, 30 min. was selected as the attribute level of duration. For the ticket price attribute, the reference price for the time of the study design (25 \in) and a 32% reduced price were considered. Price reduction was assumed to be the result of potential lower costs in higher automation levels, an expectation in line with the literature. However, the accurate estimation of a potential reduction is outside the scope of this analysis. For the study design, a D-optimal factorial design with 12 choice profiles was used with the help of XLSTAT software version 2022.3.1 [25].

Table 1. CBC attributes and attribute levels.

| Attributes | Levels |
|--------------------------|--|
| Remote driver | Human Driver A.I. under human supervision A.I. |
| Surveillance | Always During remote control Only after passenger activation |
| Communication | On-board announcements Interactive communication device Steward on-board |
| Ticket price | €25 €17 |
| Remotely driven duration | >30 min <30 min |

Each choice set included three answers: the two options and one none-of-these option. Figure 1 shows an example of a choice set.

| Category | Option 1 | Option 2 |
|--------------------------|-------------------------|---------------------------|
| Remote driver | Artificial Intelligence | Human driver |
| Surveillance | During remote control | During remote control |
| Communication | Steward on board | Interactive screen/button |
| Ticket price | 17.00€ | 17.00 € |
| Remotely driven duration | >30 min | >30 min |
| | Option 1 Op | ition 2 None of these |

Figure 1. An example of a choice set.

4. Results

One-hundred-eighty-six people completed the online survey (Appendix A). Young people (<34) and people with higher education (77% with a bachelor's degree or higher) are overrepresented. This is mainly due to the method of data collection. The reach of the survey was limited to online survey users who speak English or German. The majority of responses came from Germany (61%), while 22% came from other EU-countries and 17% from the rest of the world. 96% of the respondents had a high-income country of residence, while only 8 respondents were in a low- or middle-income country according to the World Bank classification [26].

Twenty-two percent of all the respondents think they are early adopters of technology products, while 13% consider themselves among the last. Awareness of automated transport technology was relatively high. Ninety-four percent of all the respondents had heard of automated vehicles (AV), and 43% of those had personal experiences with AVs. These were mostly with driverless urban rail systems. However, only 56% had heard of teleoperated vehicles prior to this survey. Descriptive statistics are given in Appendix B.

4.1. Automated Trains

The Figure 2 below shows the distribution of responses regarding the importance of several aspects in rail transport. All factors were considered important by the respondents, but reliability and safety received the highest proportion of positive answers. The least crucial factors were sustainability and comfort.

Attitudes towards driverless trains were rated positively by the majority. Sixty-five percent of the respondents support the implementation of driverless trains. In order to analyze the effect of prior experience with AV and awareness of teleoperation technology, the responses to the attitude towards driverless trains were compared between the two groups. The group labeled "AV-experienced" has respondents with prior experience with an automated vehicle or system and those who had heard of teleoperation technology prior to the survey. The distribution of answers is given in Figure 3 below. In total, 71% of this group have a positive attitude, while this value for the other group is 63%. More importantly, the AV-experienced group has three times more respondents that strongly support the implementation of driverless trains.

Another question inquired about passengers' views on the importance of rail personnel for rail operations. Figure 4 shows that around half of the respondents think that train drivers are not crucial for the operation of rail services. This is in line with the results of the support for driverless trains. However, the presence of an onboard staff is highly preferred. The respondents still prefer GoA-3 systems (53%) over GoA-4 systems (13%).

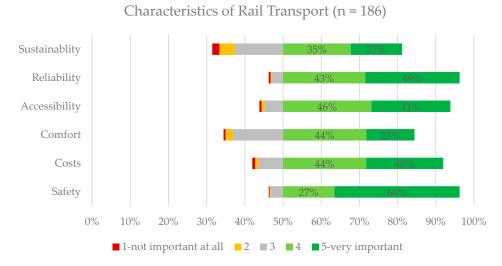


Figure 2. Important aspects of rail transport.

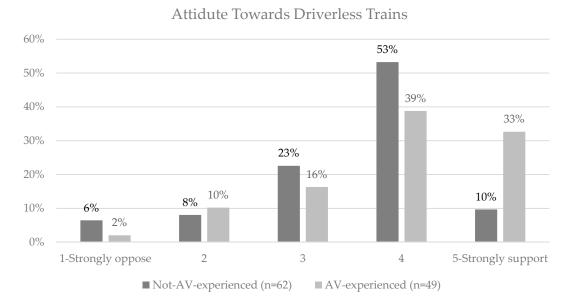


Figure 3. General opinion towards driverless trains.



Figure 4. Importance of rail personnel for rail operations.

4.2. Teleoperation

The importance of the factors regarding the implementation of teleoperated trains was evaluated by the respondents. Potential aspects of teleoperation were determined with reference to the frequently discussed benefits of railway automation in the literature. These benefits include, among others, operational efficiency, cost savings, and stability of the schedule [27]. Therefore, this survey question aims to explore the importance of aspects that can influence respondents' preferences for future systems. Whether or how teleoperation can achieve these goals is outside of the scope of this study.

Reduced delays caused by disruptions are rated highest in terms of importance, while lower ticket prices seemed to be the least important determinant in choosing this railway system as the preferred option (Figure 5).

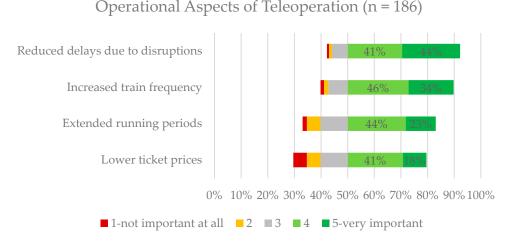


Figure 5. Factors that would influence passengers for considering teleoperation as preferred option.

The aspects of teleoperation were analyzed with regard to the age of the respondents (Figure 6). Two age groups were defined for probing the effect of age on importance rates: a younger group under 25 years (n = 74), and an older group over 35 years (n = 50). The age group of 25–35 was excluded in order to consider extreme ends of the age spectrum within the dataset. Younger respondents attribute higher importance to lower ticket prices for the implementation of teleoperation (H statistic = 6.5867, (1, n = 122), p = 0.01027). Even though the importance of reduced delays is rated highest by both groups, this seems much higher for younger people (H statistic = 5.081, (1, n = 122), p = 0.02419).

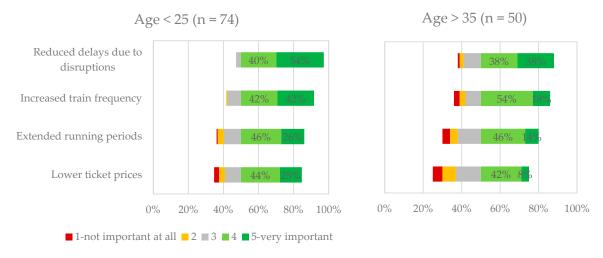


Figure 6. Importance of the Operational Aspects of Teleoperation per age.

Acceptable safety levels were inquired with comparison to the safety perception of the current systems. The respondents were divided into two country classes, Germany and others, in order to compare the public opinion in Germany with the rest of the respondents. Figure 7 shows the answers of the respondents from Germany and from other countries. The respondents in Germany have lower safety requirements, with 34% thinking it is acceptable to have the same level of safety as the trains of today. Nevertheless, 43% expect fewer accidents from new systems. On the other hand, 39% of the respondents in the other category expect much fewer accidents (i.e., reduction by half or more) from driverless vehicles with a teleoperation fallback. The Kruskal–Wallis test (KW) showed that the difference between the groups was statistically significant ($\chi^2(2) = 6.984$, n = 186, p = 0.008).

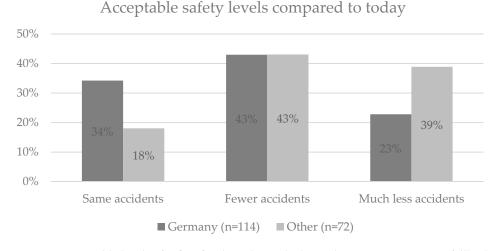


Figure 7. Acceptable levels of safety for driverless vehicles with remote operation as fallback system.

The last question of the first part of the survey collected responses to statements on several aspects of teleoperation. Figure 8 below shows the distribution of answers. Statement 4 has the most equally distributed responses compared to the other statements. Thirty-three percent of respondents are unsure about the state of the technology for safe teleoperation, and 30% think the current state of technology would not be sufficient. The majority of the respondents (68%) think that the use of a remote operator for fallback level is a good idea. However, only half of the respondents think teleoperation can reduce delays caused by disturbances. The threat of cybersecurity is another aspect that people mostly agree on.

Country-wise comparison resulted in significant differences only for statements 4 and 6. The Kruskal–Wallis H test indicated that there is a significant difference across country of residence at 95% confidence level for statement 4 (H = 9.035, n = 114-72, p = 0.0027) and statement 6 (H = 5.97, n = 114-72, p = 0.0145). Parallel to the results of the acceptable level of safety, responses to statement 6 indicate a higher trust of the automated system in Germany compared to the other group (Figure 9). These statements did not differ significantly between younger and older age groups.

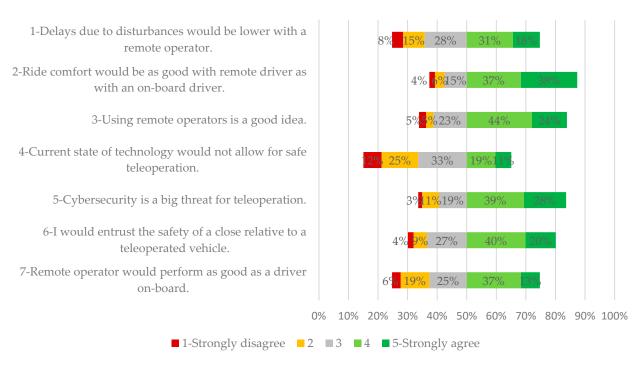


Figure 8. Passenger statements on teleoperation in railways.



Figure 9. Statements on technology capability (left) and trust in the system (right).

4.3. Choice-Based Conjoint Analysis

The table below (Table 2) shows the utilities of the attribute levels. For most of the attributes, the signs and relative magnitudes of the parameter values are reasonable. For example, the higher ticket price attribute has a negative and lower utility. However, contrary to expectations, the longer duration of the remote driving option received higher utility value in the respective attribute. In the attribute of remote driver types, the level of automated remote driving received the highest utility value (0.682). The highest utility within the surveillance type is the level of surveillance during teleoperation rather than continuous surveillance. According to the choice analysis, a communication system consisting of an interactive interface is preferable to the presence of a steward on board. The attribute level none-of-these indicates the high utility of an alternative that is not captured by the analysis.

| Attribute | Levels | Utility | Std. Dev. |
|-----------------|---------------------------------|---------|-----------|
| | A.I. | 0.682 | 0.077 |
| Remote driver | A.I. under human supervision | -0.477 | 0.100 |
| | Human driver | -0.205 | 0.079 |
| | Always | -0.320 | 0.107 |
| Surveillance | During remote control | 0.606 | 0.105 |
| | Only after passenger activation | -0.286 | 0.098 |
| | Interactive device | 0.242 | 0.085 |
| Communication | Onboard announcements | 0.089 | 0.077 |
| | Steward onboard | -0.332 | 0.060 |
| Tielcot muies | €17 | 0.147 | 0.028 |
| Ticket price | €25 | -0.147 | 0.028 |
| Remotely driven | <30 min | -0.305 | 0.050 |
| duration | >30 min | 0.305 | 0.050 |
| None-of-these | - | -1.520 | 0.084 |

Table 2. Aggregated utilities of CBC attribute levels.

The results of the relative importance of the attributes are given in Figure 10. The type of remote driver had the highest relative importance on the overall judgement of the teleoperation services (32.5%). The ticket price attribute had the lowest relative importance (8.2%). The type of surveillance (26%) for remote operations was rated more important than the type of communication channels (16.1%). The differences between the two age groups in terms of attribute importance are given in Figure 11 below.

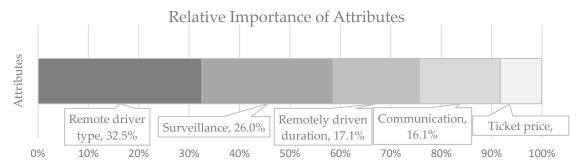


Figure 10. Relative importance of attributes.

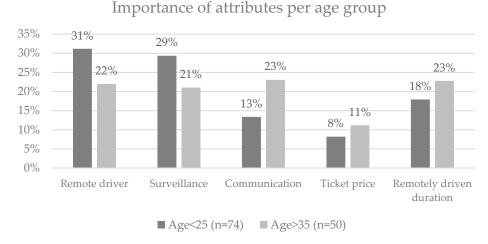


Figure 11. Relative importance of attributes for younger and older groups.

5. Discussion

Support for the implementation of highly automated rail transport is high among respondents, as often seen in the existing research literature. This is especially true for

those who have previous experience with automated vehicles. Even though driverless operation is supported by many, the presence of onboard personnel is highly preferred. This preference is also in line with previous research. Factors such as personal security in automated vehicles as well as the need for assistance for disabled individuals might have played a role in this result. Additionally, the GoA-3 operation is preferred over the GoA-4 operation. This highlights the importance of human intervention from the passengers' perspective. Teleoperation with human operators as a fallback layer has the potential to increase the acceptance of this system, especially in the transition period.

Respondents rated reliability and safety highest among the identified service quality aspects of rail transport. This is important, as remote operation has the potential to increase operational reliability by fast recovery after disruptions. Reduction of delays due to disruptions is considered as the most important factor to justify implementation of teleoperation, especially among young passengers. Ticket price was considered more important by younger passengers.

The importance of safety was observed in multiple indicators. The majority of respondents demand increased safety levels from automated rail transport and remote fallback operation. The survey results revealed that trust in the system is an important factor to be addressed. Trust in the system and in acceptable safety levels showed differences between Germany and the other countries. This indicates that local differences in safety perception must be taken into consideration for the implementation of these systems. Additionally, passengers with prior experience with an automated vehicle are more supportive of the implementation of driverless trains. Cybersecurity is one of the common concerns regarding teleoperation.

The type of remote driver and the surveillance of the operation are very important according to the CBC analysis. Continuous surveillance of the vehicle during remote control is preferred by respondents. Perceived risk and potential threats to personal security might have played a role in this rating. Even though the respondents reported that onboard staff are still crucial, choice analysis suggests that, given the choice, passengers would instead prefer an automated and interactive communication channel.

It should be noted that the number of respondents (186) and the representation of the whole population through the sample (in terms of age, education level, etc.) impose limitations for this study.

6. Conclusions

Even though the teleoperation service for railways is currently not available to the public, a few trends can be identified by analyzing the study results. Overall, the teleoperation system and its capabilities received positive feedback. The results of this questionnaire and choice-based conjoint analysis reveal several aspects that are important for the acceptability of teleoperation. Future implementation plans should address perceived safety, security, and trust concerns. Demographic aspects such as age, country of residence, technology awareness, and prior experience with AVs could influence the acceptance of these systems. Teleoperation as a fallback system provides an opportunity for increasing the resilience and reliability of rail systems, as agreed by most of the respondents.

Author Contributions: Conceptualization, B.C. and J.T.; methodology, B.C.; investigation, B.C. and J.T.; formal analysis, B.C.; data curation, B.C.; writing—original draft preparation, B.C.; writing—review and editing, B.C., J.T. and B.M.; visualization, B.C. and J.T.; supervision, B.M. All authors have read and agreed to the published version of the manuscript.

Funding: This publication was funded by the German Research Foundation and the Open Access Publication Fund of TU Berlin.

Institutional Review Board Statement: Not applicable.

Informed Consent Statement: Informed consent was obtained from all subjects involved in the online survey.

Data Availability Statement: Available upon request.

Acknowledgments: The authors gratefully acknowledge the support in dissemination of the survey by partners of the Drive2theFuture consortium (GA 815001).

Conflicts of Interest: The authors declare no conflict of interest.

Appendix A

Table A1. Detailed profile of survey respondents.

| Education level Min Bachelor's 144 Less than Bachelor's 42 Gender Male 100 Female 81 Other 5 Heard of AVs Yes 174 No 12 Experience with AVs Yes 80 No 106 Heard of Teleoperation Yes 104 No 82 When it comes to trying new technologies, I am Among the first 40 In the middle 121 Among the last 25 Age under 18 4 18-24 68 | Respondent Profile | # |
|--|-----------------------------|--------------------|
| Less than Bachelor's | Education I | evel |
| Gender Male 100 Female 81 Other 5 Heard of AVs Yes 174 No 12 Experience with AVs Yes 80 No 106 Heard of Teleoperation Yes 104 No 82 When it comes to trying new technologies, I am Among the first 40 In the middle 121 Among the last 25 Age under 18 | Min Bachelor's | 144 |
| Male 100 Female 81 Other 5 Heard of AVs Yes 174 No 12 Experience with AVs Yes 80 No 106 Heard of Teleoperation Yes 104 No 82 When it comes to trying new technologies, I am Among the first 40 In the middle 121 Among the last 25 Age under 18 | Less than Bachelor's | 42 |
| Female 81 Other 5 Heard of AVs Yes 174 No 12 Experience with AVs Yes 80 No 106 Heard of Teleoperation Yes 104 No 82 When it comes to trying new technologies, I am Among the first 40 In the middle 121 Among the last 25 Age 4 under 18 4 | Gender | : |
| Other 5 Heard of AVs Yes 174 No 12 Experience with AVs Yes 80 No 106 Heard of Teleoperation Yes 104 No 82 When it comes to trying new technologies, I am Among the first 40 In the middle 121 Among the last 25 Age under 18 | Male | 100 |
| Heard of AVs Yes 174 No 12 Experience with AVs Yes 80 No 106 Heard of Teleoperation Yes 104 No 82 When it comes to trying new technologies, I am Among the first 40 In the middle 121 Among the last 25 Age under 18 | Female | 81 |
| Yes 174 No 12 Experience with AVs Yes 80 No 106 Heard of Teleoperation Yes 104 No 82 When it comes to trying new technologies, I am Among the first 40 In the middle 121 Among the last 25 Age under 18 | Other | 5 |
| Experience with AVs Yes 80 No 106 Heard of Teleoperation Yes 104 No 82 When it comes to trying new technologies, I am Among the first 40 In the middle 121 Among the last 25 Age under 18 | Heard of A | AVs |
| Experience with AVs Yes 80 No 106 Heard of Teleoperation Yes 104 No 82 When it comes to trying new technologies, I am Among the first 40 In the middle Among the last 25 Age under 18 4 | Yes | 174 |
| Yes 80 No 106 Heard of Teleoperation Yes 104 No 82 When it comes to trying new technologies, I am Among the first 40 In the middle 121 Among the last 25 Age under 18 4 | No | 12 |
| No 106 Heard of Teleoperation Yes 104 No 82 When it comes to trying new technologies, I am Among the first 40 In the middle 121 Among the last 25 Age under 18 4 | Experience wi | th AVs |
| Heard of Teleoperation Yes 104 No 82 When it comes to trying new technologies, I am Among the first 40 In the middle 121 Among the last 25 Age under 18 4 | Yes | 80 |
| Yes 104 No 82 When it comes to trying new technologies, I am Among the first 40 In the middle 121 Among the last 25 Age under 18 4 | No | 106 |
| No 82 When it comes to trying new technologies, I am Among the first 40 In the middle 121 Among the last 25 Age under 18 4 | Heard of Teleo | peration |
| When it comes to trying new technologies, I am Among the first 40 In the middle 121 Among the last 25 Age under 18 4 | Yes | 104 |
| Among the first 40 In the middle 121 Among the last 25 Age under 18 4 | No | 82 |
| In the middle 121 Among the last 25 Age under 18 4 | When it comes to trying new | technologies, I am |
| Among the last 25 Age under 18 4 | Among the first | 40 |
| Age under 18 4 | In the middle | 121 |
| under 18 4 | Among the last | 25 |
| | Age | |
| 18_2/1 69 | under 18 | 4 |
| 10-24 00 | 18–24 | 68 |
| 25–34 64 | 25–34 | 64 |
| 35–44 24 | 35–44 | 24 |
| 45–64 26 | 45–64 | 26 |

Table A2. Transport mode choice.

| Transport Mode Choice | Commuting | Business Travel | Leisure/Social | Errands | Vacation |
|-----------------------------|-----------|-----------------|----------------|---------|----------|
| Passenger car/motorcycle | 29% | 20% | 29% | 33% | 28% |
| Public transport | 23% | 20% | 17% | 12% | 12% |
| Taxi | 4% | 8% | 4% | 2% | 4% |

Table A2. Cont.

| Transport Mode Choice | Commuting | Business Travel | Leisure/Social | Errands | Vacation |
|-------------------------|-----------|-----------------|----------------|---------|----------|
| Bicycle/walking | 32% | 5% | 36% | 46% | 10% |
| Airplane | 1% | 19% | 4% | 1% | 34% |
| Ship | 1% | 2% | 3% | 0% | 8% |
| Sharing services | 1% | 2% | 6% | 3% | 2% |
| I don't take such trips | 8% | 24% | 1% | 2% | 2% |

Appendix B

 Table A3. Descriptive statistics.

| | | | | | | Quantiles | |
|---|-------|-----------------|----------------|-------|------|-----------|------|
| Items | Mean | Median | SD | CI | 25% | 50% | 75% |
| | Impo | rtant aspects o | of rail transp | ort | | | |
| Safety | 4.56 | 5 | 0.687 | 0.099 | 4 | 5 | 5 |
| Costs | 4.19 | 4 | 0.839 | 0.121 | 4 | 4 | 5 |
| Comfort | 3.88 | 4 | 0.866 | 0.124 | 3 | 4 | 4.75 |
| Accessibility | 4.25 | 4 | 0.780 | 0.112 | 4 | 4 | 5 |
| Reliability | 4.39 | 4 | 0.720 | 0.103 | 4 | 4 | 5 |
| Sustainability | 3.74 | 4 | 1.059 | 0.152 | 3 | 4 | 5 |
| Attitude towards driverless trains | 3.67 | 4 | 1.063 | 0.153 | 3 | 4 | 4 |
| | In | portance of ra | il personnel | | | | |
| Train driver | 3.46 | 4 | 1.106 | 0.159 | 3 | 4 | 4 |
| On-board staff | 3.90 | 4 | 1.125 | 0.162 | 3 | 4 | 5 |
| | Opera | tional aspects | of teleopera | tion | | | |
| Reduced delays due to disruptions | 4.23 | 4 | 0.859 | 0.123 | 4 | 4 | 5 |
| Increased train frequency | 4.05 | 4 | 0.926 | 0.133 | 4 | 4 | 5 |
| Extended running periods | 3.72 | 4 | 1.028 | 0.148 | 3 | 4 | 4 |
| Lower ticket prices | 3.46 | 4 | 1.195 | 0.172 | 3 | 4 | 4 |
| Acceptable safety levels (3-point-scale) | 2.01 | 2 | 0.757 | 0.109 | 1 | 2 | 3 |
| | | Passenger sta | atements | | | | |
| 1-I believe the delays due to disturbances would be lower with a remote operator | 3.38 | 3 | 1.162 | 0.167 | 3 | 3 | 4 |
| 2-I believe ride comfort would be as good with a remote driver as with an on-board driver | 3.99 | 4 | 1.065 | 0.153 | 3.25 | 4 | 5 |
| 3-I think that using remote operators is a good idea | 3.77 | 4 | 1.022 | 0.147 | 3 | 4 | 4 |
| 4-I believe the current state of technology would not allow for safe teleoperation | 2.91 | 3 | 1.169 | 0.168 | 2 | 3 | 4 |
| 5-I believe cybersecurity is a big threat for teleoperation | 3.79 | 4 | 1.062 | 0.153 | 3 | 4 | 5 |

| _ | | | | \sim . |
|----|----|---|------------|----------|
| 13 | hı | Δ | Δ 3 | Cont. |
| 1a | v | | ΔU | Con. |

| | | | | | | Quantiles | |
|--|------|--------|-------|-------|------|-----------|-----|
| Items | Mean | Median | SD | CI | 25% | 50% | 75% |
| 6-I would entrust the safety of a close relative to a teleoperated vehicle | 3.64 | 4 | 1.026 | 0.147 | 3 | 4 | 4 |
| 7-I believe the remote operator would perform as well as a driver on-board | 3.31 | 3 | 1.105 | 0.159 | 2.25 | 3 | 4 |

References

- 1. Distler, V.; Lallemand, C.; Bellet, T. Acceptability and acceptance of autonomous mobility on demand. In Proceedings of the 2018 CHI Conference on Human Factors in Computing Systems, CHI'18, Montreal, QC, Canada, 21–26 April 2018; Mandryk, R., Ed.; ACM: New York, NY, USA, 2018; pp. 1–10, ISBN 9781450356206.
- 2. Masson, É.; Richard, P.; Garcia-Guillen, S.; Adell, G.M. TC-Rail: Railways remote driving. In Proceedings of the 12th World Congress on Railway Research, Tokyo, Japan, 28 October–1 November 2019.
- 3. Gadmer, Q.; Pacaux-Lemoine, M.-P.; Richard, P. Human-automation—Railway remote control: How to define shared information and functions? *IFAC-PapersOnLine* **2021**, *54*, 173–178. [CrossRef]
- 4. Pacaux-Lemoine, M.-P.; Gadmer, Q.; Richard, P. Train remote driving: A human-machine cooperation point of view. In Proceedings of the 2020 IEEE International Conference on Human-Machine Systems (ICHMS), Rome, Italy, 7–9 September 2020; IEEE: Manhattan, NY, USA, 2020; pp. 1–4, ISBN 978-1-7281-5871-6.
- 5. Brandenburger, N.; Naumann, A. Towards remote supervision and recovery of automated railway systems: The staff's changing contribution to system resilience. In Proceedings of the 2018 International Conference on Intelligent Rail Transportation (ICIRT), Singapore, 12–14 December 2018; IEEE: Manhattan, NY, USA, 2018; pp. 1–5, ISBN 978-1-5386-7528-1.
- Tonk, A.; Boussif, A.; Beugin, J.; Collart-Dutilleurl, S. Towards a specified operational design domain for a safe remote driving of trains. In Proceedings of the 31st European Safety and Reliability Conference, Angers, France, 19–23 September 2021.
- 7. Aktouche, S.R.; Sallak, M.; Bouabdallah, A.; Schön, W. Towards reconciling safety and security risk analysis processes in railway remote driving. In Proceedings of the 2021 5th International Conference on System Reliability and Safety (ICSRS), Palermo, Italy, 24–26 November 2021; pp. 148–154.
- 8. Cogan, B.; Milius, B. Development and optimization of an HMI for the remote control of automated trains in case of a system disruption: Work-in-progress. In Proceedings of the 7th Humanist Conference, Rhodes, Greece, 26–27 October 2021; ISBN 978-2-9531712-6-6.
- 9. Bansal, P.; Kockelman, K.M.; Singh, A. Assessing public opinions of and interest in new vehicle technologies: An Austin perspective. *Transp. Res. Part C Emerg. Technol.* **2016**, *67*, 1–14. [CrossRef]
- Pakusch, C.; Bossauer, P. User acceptance of fully autonomous public transport. In Proceedings of the 14th International Joint Conference on e-Business and Telecommunications, Madrid, Spain, 24–26 July 2017; SCITEPRESS—Science and Technology Publications: Setúbal, Portugal, 2017; pp. 52–60, ISBN 978-989-758-257-8.
- 11. Morast, A.; Voß, G.M.I.; Dautzenberg, P.S.C.; Urban, P.; Nießen, N. A survey on the acceptance of unattended trains. *SSRN Electron. J.* 2022. [CrossRef]
- 12. Šotek, M.; Márton, P.; Lendel, V.; Lendelová, L. Investigation of opinions on the acceptance of autonomous railway vehicles in Slovakia. *Transp. Res. Procedia* **2021**, *55*, 1337–1344. [CrossRef]
- 13. Nordhoff, S.; Kyriakidis, M.; van Arem, B.; Happee, R. A multi-level model on automated vehicle acceptance (MAVA): A review-based study. *Theor. Issues Ergon. Sci.* **2019**, 20, 682–710. [CrossRef]
- 14. Jing, P.; Xu, G.; Chen, Y.; Shi, Y.; Zhan, F. The determinants behind the acceptance of autonomous vehicles: A systematic review. *Sustainability* **2020**, *12*, 1719. [CrossRef]
- 15. Zhang, T.; Tao, D.; Qu, X.; Zhang, X.; Lin, R.; Zhang, W. The roles of initial trust and perceived risk in public's acceptance of automated vehicles. *Transp. Res. Part C Emerg. Technol.* **2019**, *98*, 207–220. [CrossRef]
- 16. Dong, X.; DiScenna, M.; Guerra, E. Transit user perceptions of driverless buses. Transportation 2019, 46, 35–50. [CrossRef]
- 17. Fraszczyk, A.; Brown, P.; Duan, S. Public perception of driverless trains. Urban Rail Transit 2015, 1, 78-86. [CrossRef]
- 18. Krueger, R.; Rashidi, T.H.; Rose, J.M. Preferences for shared autonomous vehicles. *Transp. Res. Part C Emerg. Technol.* **2016**, *69*, 343–355. [CrossRef]
- 19. Soe, R.-M.; Müür, J. Mobility acceptance factors of an automated shuttle bus last-mile service. *Sustainability* **2020**, *12*, 5469. [CrossRef]
- 20. Becker, F.; Axhausen, K.W. Literature review on surveys investigating the acceptance of automated vehicles. *Transportation* **2017**, 44, 1293–1306. [CrossRef]
- 21. Eggers, F.; Sattler, H.; Teichert, T.; Völckner, F. Choice-based conjoint analysis. In *Handbook of Market Research*; Homburg, C., Klarmann, M., Vomberg, A., Eds.; Springer: Cham, Switzerland, 2022; pp. 781–819, ISBN 978-3-319-57411-0.
- 22. Maas, B. Conjoint analysis of mobility plans in the city of Dresden. Eur. Transp. Res. Rev. 2021, 13, 25. [CrossRef]

23. König, A.; Bonus, T.; Grippenkoven, J. Analyzing urban residents' appraisal of ridepooling service attributes with conjoint analysis. *Sustainability* **2018**, *10*, 3711. [CrossRef]

- 24. Keller, K.; Zimmerman, C.; Zibuschka, J.; Hinz, O. Trust is good, control is better—Customer preferences regarding control in teleoperated and autonomous taxis. In Proceedings of the 54th Hawaii International Conference on System Sciences, HICSS 2021, Kauai, HI, USA, 5 January 2021; ScholarSpace: Ann Arbor, MI, USA, 2021.
- 25. Addinsoft. XLSTAT Statistical and Data Analysis Solution. Available online: https://www.xlstat.com (accessed on 17 October 2022).
- 26. World Bank Country and Lending Groups—World Bank Data Help Desk. Available online: https://datahelpdesk.worldbank.org/knowledgebase/articles/906519-world-bank-country-and-lending-groups (accessed on 16 August 2022).
- 27. Pachl, J. Betriebliche randbedingungen für autonomes fahren auf der schiene. Deine Bahn 2017, 9, 10-19.