

Pobudzei, Tiessler, Sellaouti, Hoffmann

1 **E-Scooter and Bicycle Accidents: Spatial, Temporal, and Demographic Characteristics in**
2 **Munich, Germany**

3
4 **Maryna Pobudzei**

5 Professorship for Intelligent, Multimodal Transportation Systems
6 University of the Bundeswehr Munich, Werner-Heisenberg-Weg 39, 85577 Neubiberg, Germany
7 Email: maryna.pobudzei@unibw.de
8 ORCID: 0000-0002-3219-9144

9
10 **Michaela Tiessler**

11 Professorship for Intelligent, Multimodal Transportation Systems
12 University of the Bundeswehr Munich, Werner-Heisenberg-Weg 39, 85577 Neubiberg, Germany
13 Email: michaela.tiessler@unibw.de
14 ORCID: 0000-0002-8453-0273

15
16 **Anis Sellaouti**

17 Professorship for Intelligent, Multimodal Transportation Systems
18 University of the Bundeswehr Munich, Werner-Heisenberg-Weg 39, 85577 Neubiberg, Germany
19 Email: anis.sellaouti@unibw.de
20 ORCID: 0000-0002-6702-2197

21
22 **Silja Hoffmann**

23 Professorship for Intelligent, Multimodal Transportation Systems
24 University of the Bundeswehr Munich, Werner-Heisenberg-Weg 39, 85577 Neubiberg, Germany
25 Email: silja.hoffmann@unibw.de
26 ORCID: 0000-0002-0499-0342

27
28 *5.919 words + 2 Tables * 250 words = 6.419 words*

29
30 *Submitted 19.07.2022*

31

1 ABSTRACT

2 Since June 2019, e-scooters have been allowed on German public roads and enhanced the micromobility
3 landscape in urban areas. E-scooter riders are subject to the same rules as bicyclists. Comparing the
4 casualties of both modes over an extended time frame gives an insight into the evolution of micromobility
5 crashes in the city. This study i) analyzes comprehensive data on e-scooter and bicycle collisions during 31
6 months in Munich, Germany; and b) uncovers the spatial, temporal, and demographic characteristics of
7 both e-scooter and bicycle accidents. In Munich, micromobility incidents concentrate on primary roads with
8 many adjacent intersections and mixed land use. E-scooter crashes occur predominantly in the city center,
9 whereas bicycle collisions are distributed more across the city. The incident rates increase when the weather
10 is mild. E-scooter casualties are more common on Fridays and Saturdays, in the evening and night, whereas
11 bike crashes prevail on weekdays in the morning and afternoon. The bicyclists are, on average, older than
12 e-scooter drivers and their age distribution is more expansive. The percentage of intoxicated casualties and
13 hit-and-run cases is relatively higher among e-scooter users than among cyclists. The accident data showed
14 an increased probability of involved drunk men at night. Severe injuries and single-person accidents,
15 presumably due to lost control, are more common when driving intoxicated. Understanding the dynamics
16 of e-scooter and bicycle accidents provides value to policymakers managing these modes' usage and safety
17 measures and micromobility planners making operational and safety strategies decisions.

18
19

20 **Keywords:** e-scooter, bicycle, micromobility, Munich, Germany, accident, collision, casualty, crash, traffic
21 safety

1 INTRODUCTION

2 Electric scooters (e-scooters) have been allowed on public roads in Germany since 15th June 2019
3 (1). These novel transport modes were immediately popular with riders in urban areas, presumably due to
4 their ease of use, convenience, and relatively low cost (2, 3). Their speed is limited to 20 km/h, carriage of
5 passengers is not allowed, and the maximum weight of the vehicle without the rider is 55 kg. Each e-scooter
6 must have vehicle liability insurance: about 180,000 e-scooters are insured in Germany (4). These electric
7 vehicles must have front and rear lights, two separately functioning brakes, a narrow platform, and a waist-
8 high rod with handlebars for steering. After kicking off with one foot, riders accelerate and brake the scooter
9 using triggers activated with their thumbs (5). Wearing a helmet while riding an e-scooter is not compulsory.

10 E-scooter riders do not require a driving license but must be older than 14. They must share the
11 infrastructure with bicyclists. If there is no bike path, they can drive on roads with cars. Riding on sidewalks
12 is taboo (1). An alcohol limit of 0.5 per mille applies. Individuals under 21 years old and drivers holding a
13 driving license for fewer than two years are not allowed to consume alcohol before riding an e-scooter.
14 Although local governments and e-scooter service providers strive for regulations for safe riding, the public
15 discussion focuses on the increasing involvement of e-scooters in traffic accidents. On the one hand, some
16 riders might not have enough experience handling e-scooters due to the novelty of the vehicle concept. On
17 the other hand, offenses such as e-scooters riding on sidewalks or while intoxicated have occurred regularly
18 in the press (6–10).

19 Several studies explored the characteristics of e-scooter crashes (5, 7, 11–24). However, few studies
20 approached the spatial, temporal, and demographic characteristics of accidents involving bicyclists and e-
21 scooter riders to create a comparable database on the dangers of these micromobility modes. Furthermore,
22 there is still a lack of public awareness of the proper use of e-scooters and the consequences of the incidents.
23 Our study makes several novel contributions to the existing literature by analyzing comprehensive data on
24 e-scooter and bicycle accidents during 31 months in Munich, Germany, and uncovering and comparing the
25 spatial, temporal, and demographic characteristics of both e-scooter and bicycle collisions. Understanding
26 the dynamics of e-scooter and bicycle accidents provides value to policymakers managing these modes’
27 usage and safety measures and micromobility planners making operational and safety strategies decisions.

28 RELEVANT LITERATURE

29 Bicycles and electric scooters are popular micromobility modes, but they carry different patterns
30 of injury risks (**Table 1**). 5.3 reported injuries to e-scooter riders and 385.4 pedal bicycle injuries per 10,000
31 emergency department injuries were in the United States (25). Injuries on rented e-scooters account for 2.2
32 emergency department visits per 10,000 miles traveled (26) - much higher than the national average for
33 motorbikes (0.05 per 10,000 miles) and cars (0.1 per 10,000) (27). In Germany, e-scooter crashes in 2021
34 increased due to more people using these transport modes (28, 29). Many accidents and near-accidents
35 might not be reported to the police (16, 24, 29, 30). In 2020, the insurers in Germany paid an average of
36 €3,850 for each e-scooter incident (4). The figure was only €700 lower than the average sum paid to those
37 injured in car accidents throughout Germany (4).

38 Around the world, patients presenting to the emergency departments after e-scooter-related
39 accidents are around 30 years and the majority are male (5, 7, 8, 11, 16, 31–33). A significant subset of
40 injuries occurs in patients younger than 25 (5, 32, 34). The most significant number of people involved in
41 bicycle collisions is between 33 and 49 (25). People between 10 and 24 account for nearly one-third of all
42 injuries due to bicycle incidents (35). Males make up most cyclist casualties (25, 35, 36). Peaks of e-scooter-
43 related emergency department visits are during summer, on weekends, and during the late evening and night
44 hours (7, 11, 15, 17, 18, 24). Most bicycle accidents occur when traffic is saturated during the week and on
45 weekends when light conditions are low (24, 37). Due to the relatively high speed and the low fall height
46 with a short reaction time, the extremities, especially the upper and lower limbs, head, and neck, are the
47 most commonly affected body areas for both e-scooter riders and cyclists (5, 7, 8, 11, 16, 17, 20, 31, 33,
48 38). Many researchers insist on mandatory helmet usage that would reduce the rate of concussions and
49 severe traumatic brain injuries (5, 7, 16, 17, 20, 38). The use of e-scooters without a helmet is in almost all

1 **TABLE 1 Bicycle and E-scooter Accident Characteristics in Literature**

Accident Characteristic	Bicycle	E-scooter
Sex	> 50 % male (25, 35, 36)	> 50 % male (5, 7, 8, 11, 16, 31–33)
Age	33 – 49 years (25, 35)	~ 30 years (5, 7, 8, 11, 16, 31–33)
Time	Daytime on workdays; late evening and night on weekends (24, 37)	Summer, weekends, late evening, and night (7, 11, 15, 17, 18, 24)
Affected body areas	Extremities (5, 7, 8, 11, 16, 17, 20, 31, 33, 38)	
Spatial distribution	City centers, major employment centers, universities, and commercial strips (18, 24, 25, 37, 39, 40)	

2
3 accident cases (5, 7, 8, 17, 20, 31, 38), but most cyclists wear headgear (16). Even in countries where
4 helmets are mandatory, e-scooter riders rarely wear them (23). E-scooter riders with crashes without
5 wearing a helmet have significantly more extended hospital stays than cyclists using protective gear (16).
6 To determine how much emphasis is on safety in the marketing of e-scooters, researchers in the U.S.
7 examined the official Instagram account of a leading shared e-scooter provider (41). The company's official
8 posting lacked protective gear in pictures and comments, which might impact its customers as it normalized
9 risky behavior.

10 Regarding spatial distribution, the e-scooter and bicycle crashes are near the major employment
11 centers, universities, and commercial strips in urban regions (18, 24, 25, 37, 39, 40). Compared to traffic
12 incidents, e-scooter incidents tend to occur adjacent to traffic signals and on central primary roads (40). In
13 Milan, the density of e-scooter accidents is associated with the concentration of sidewalk surfaces, road
14 intersections, and neighborhood shops (18). Weaker positive correlations were between e-scooter casualties
15 and population density, pedestrian areas, public transport stops, bike paths, urban fabric, commercial
16 activities, and local streets (18). Similar results were in Texas: residential land use, street length and type,
17 number of street nodes, and traffic signals were statistically significant determinants of e-scooter accidents
18 (40). One of the causes of collisions involving e-scooters was intoxication (6, 8–11, 19, 31, 34) and
19 incorrectly using cycle lanes or riding on the sidewalks (4, 13, 32, 42). Driving on pathways creates tensions
20 with pedestrian categories, such as children, seniors, and people with disabilities (23). One of the reasons
21 why e-scooters go on footpaths is a lack of dedicated infrastructure that could guarantee road safety (18).
22 Most e-scooter accidents resulting in personal injury involve only the e-scooter rider (17, 19, 32) when they
23 lose their balance and fall (8, 23). Furthermore, collision with a curb is among the common causes of
24 e-scooter crashes (17), while for cyclists, it is slipping away on tram rails (16). Both e-scooter riders and
25 cyclists crash into cars (32) coming from the car's right, where car drivers are not expecting the vehicles to
26 enter traffic (43).

27 E-scooter fatalities are rare (43): a trip by standing e-scooter in a dense urban area is less likely to
28 result in a traffic fatality than a car, bicycle, or motorcycle trip (44). The data suggests that severe injuries
29 are similar to those caused by bikes. However, the representation of e-scooters in the mainstream media is
30 generally very damaging, particularly regarding safety issues (45). In 80% of the recorded fatalities, the
31 accidents involved a car resulting from unsafe infrastructure for nonmotorized vehicles (13, 43). About
32 80% of e-scooter crashes happened at intersections (13). In many cities, bicycle lanes end suddenly, leaving
33 riders in a flow of moving vehicles (13, 43). Enhancing the infrastructure by connecting bike lanes, limiting
34 right-turn-on-red, and providing intuitive ways to cross and turn at intersections would improve the safety
35 of micromobility modes (13, 43). In Germany, e-scooter riders are subject to the same rules as cyclists,
36 including mandatory helmet usage for children below 15. This study examines the micromobility crashes
37 reported to the police in Munich, Germany, since June 2019 for 31 months. The development of the spatial
38 and temporal distribution of micromobility accidents is examined in the context of the general trend of e-
39 scooter and bicycle usage in Munich. In addition, we explore the characteristics of micromobility casualties
40 and demographic attributes in the city.

METHODS

Data

For the study commissioned by the City of Munich, e-scooter and bicycle accidents reported to the police department in Munich from June 2019 to December 2021 were analyzed. The accident datasets would offer the type, GPS location, time of the accident, the number of involved persons, their level of injury (dead, seriously, light), monetary damage, age, sex, intoxication, and a statement if they committed a hit-and-run act. No data on if the collisions involved a private or shared vehicle, usage of protective gear, or an injury overview was available. Hourly aggregated weather data such as air temperature, wind speed, precipitation, air humidity, and visibility were acquired from the German Weather Service (46) to analyze the meteorological effects of e-scooter and bicycle accidents. The data were merged with the accident datasets based on the respective hour. The summary statistics on characteristics of e-scooter and bicycle accidents are in **Table 2**.

TABLE 2 Summary Statistics on E-Scooter and Bicycle Accidents, June 2019 – December 2021

Variable	Vehicle	Mean	Std	Min	Q1	Q2	Q3	Max
Number of people involved in the accident	Bicycle	1.9	0.5	1	2	2	2	8
	E-scooter	1.7	0.6	1	1	2	2	4
Number of dead persons in the accident	Bicycle	0.0	0.0	0	0	0	0	1
	E-scooter	0.0	0.0	0	0	0	0	0
Number of serious-injured persons in the accident	Bicycle	0.1	0.3	0	0	0	0	2
	E-scooter	0.1	0.3	0	0	0	0	2
Number of light-injured persons in the accident	Bicycle	0.9	0.5	0	1	1	1	4
	E-scooter	0.8	0.5	0	0	1	1	2
Age, years	Bicycle	41.2	18.4	3	27	39	54	96
	E-scooter	30.4	13.7	8	21	27	37	94
Sex (2: female)	Bicycle	1.4	0.5	1	1	1	2	2
	E-scooter	1.3	0.5	1	1	1	2	2
Damage, euro	Bicycle	784.6	2,849.5	0	0	150	800	150,300
	E-scooter	798.1	2,571.8	0	0	50	900	51,000
Alcohol consumed (1: yes)	Bicycle	0.0	0.2	0	0	0	0	1
	E-scooter	0.2	0.4	0	0	0	0	1
Drugs consumed (1: yes)	Bicycle	0.0	0.0	0	0	0	0	1
	E-scooter	0.0	0.1	0	0	0	0	1
Hit-and-run accident (1: at least one party runs away)	Bicycle	0.2	0.4	0	0	0	0	1
	E-scooter	0.3	0.5	0	0	0	1	1
Air humidity, %	Bicycle	61.6	19.4	16	46	61	78	99
	E-scooter	68.5	18.8	16	53	72	85	97
Air temperature, °C	Bicycle	16.0	7.9	-6	11	17	22	35
	E-scooter	14.9	7.4	-3	10	15	20	34
Precipitation, mm	Bicycle	0.1	0.8	0	0	0	0	28
	E-scooter	0.1	0.6	0	0	0	0	10
Visibility, m	Bicycle	47,342.5	17,968.9	120	36,608	49,950	60,320	75,000
	E-scooter	46,650.9	18,986.1	140	35,480	48,670	61,010	75,000
Wind speed, m/s	Bicycle	2.7	1.4	0	2	3	3	14
	E-scooter	2.5	1.3	0	2	2	3	9

1 Since June 2019, during 31 months, there have been 565 collisions involving e-scooter drivers and
 2 7,284 accidents involving bicyclists, which translates into 38 e-scooter and 486 bicycle accidents per
 3 100,000 population in Munich. 36% of e-scooter crashes were single-person accidents, and 59% involved
 4 two parties. The preponderance of police-reported bicycle incidents (76%) involved two parties; single-
 5 person accidents accounted for 19%. 11 bicyclists died in Munich between June 2019 and December 2021.
 6 No e-scooter riders were deadly injured. In 10% of crashes, e-scooter riders and bicyclists were seriously,
 7 and 90% were lightly injured. The mean age of bicyclists in traffic accidents (41.2 years) is a decade higher
 8 than that of e-scooter riders (30.4 years). 90% of e-scooter riders and 62% of bicyclists involved in crashes
 9 are younger than 50 years. 33% of accidental e-scooter drivers and 41% of accidental bicyclists were
 10 female.

11 Among those in e-scooter collisions involving two or more parties, 51% were other scooters, 31%
 12 were cars, 9% were bicyclists, 7% were pedestrians, and 1% were other vehicles. In bicycle crashes, other
 13 parties were 56% other bicycles, 34% cars, 5% pedestrians, 2% trucks, 1% scooters, and 2% other vehicles.
 14 The mean monetary damage in the case of both micromobility modes was under 800 euros. 20% of e-
 15 scooter drivers and 4% of bicyclists were alcohol intoxicated during the accidents. People consumed other
 16 drugs in 2% of e-scooter and 0.2% of bicycle incidents. E-scooter riders more often committed hit-and-run
 17 acts than bicyclists. Most bicycle and e-scooter crashes happen when mild weather with moderate air
 18 temperatures and humidity, no rain, light wind, and good visibility prevails.

19

20 Approach

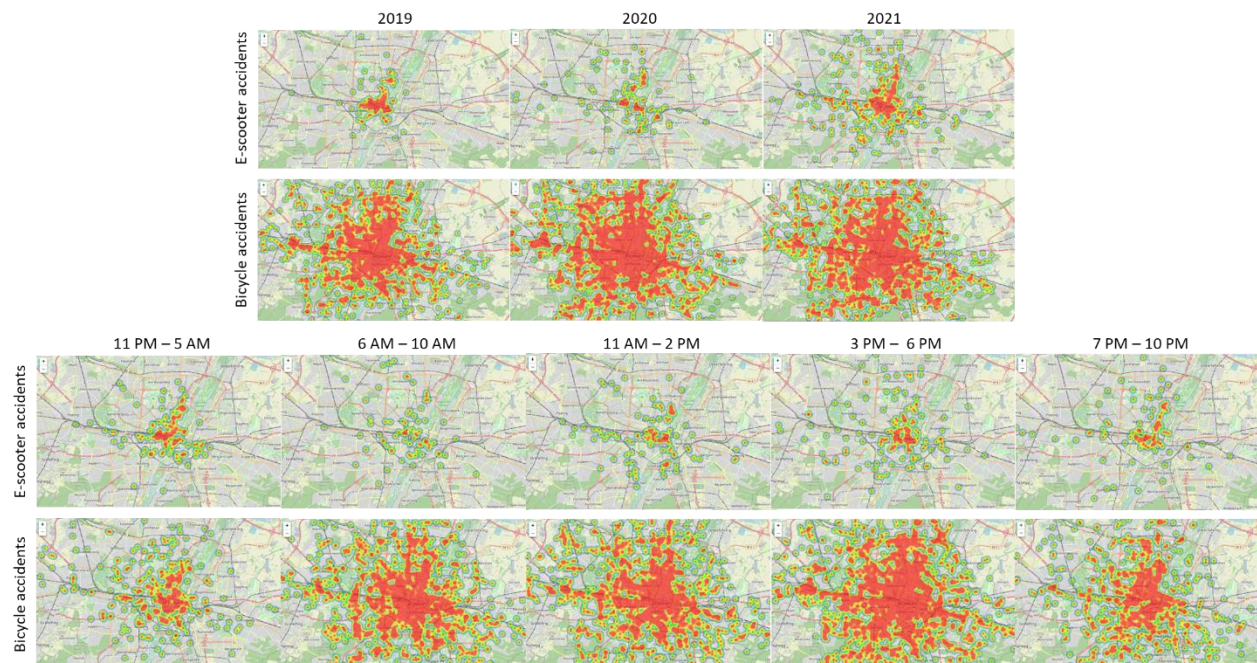
21 This study analyses spatial, temporal, and demographical characteristics of e-scooter and bicycle crashes in
 22 Munich, Germany. Heatmaps, where the GPS markers close to each other are grouped, depict the spatial
 23 allocation of police-reported incidents. Histograms and kernel density estimates (KDE) represent
 24 continuous probability density curves. Relative to a histogram, KDE does not produce discrete bins but
 25 smoothes the observation with a Gaussian kernel. This creates an interpretable plot but has the potential to
 26 introduce distortions if the underlying distribution is not smooth. An over-smoothed estimate might erase
 27 meaningful features, but an under-smoothed estimate can obscure the actual shape within random noise
 28 (47). This was addressed by choosing the proper smoothing bandwidth. To explore the relationships
 29 between the determinants of e-scooter and bicycle accidents, the strength and direction of the association
 30 were computed using Spearman's rank-order correlation (r_s) (48). This correlation is not very sensitive to
 31 outliers and can be used for non-normally distributed ordinal or continuous data. A significance level (p)
 32 less or equal to 5% is chosen for data exploration.

33

34 RESULTS AND DISCUSSION

35 There is a high degree of crash clustering in Munich areas with commercial stripes, recreation
 36 activities, parks, major employment centers, and university campuses (**Figure 1**). This corresponds to the
 37 previous findings that the e-scooter and bicycle accidents concentrate in downtown areas with mixed land
 38 use and multimodal traffic (18, 25, 37, 39, 40). Many micromobility accidents are proximate to major public
 39 transport hubs such as Hauptbahnhof (central station), Laim, Pasing, and Ostbahnhof. The highest incident
 40 rates in Munich are on the streets of Leopoldstrasse, Landsberger Strasse, Dachauer Strasse, Arnulfstrasse,
 41 Lindwurmstrasse, and Ludwigstrasse. These are long central arteries featuring shops, cinemas, hotels, open-
 42 air cafés, and restaurants. There is a lot of multimodal traffic and intersections. Separate bicycle lanes are
 43 available on these streets, but they often operate at high capacities.

44 In 2019, e-scooter accidents concentrated primarily in the city center but gradually grew in number
 45 and sprawled to other city parts in 2020 and 2021. Even though we do not have data on accidents with
 46 shared or private vehicles, the sprawl of e-scooter locations corresponds to the extension of e-scooter
 47 sharing service areas in Munich. Over the analyzed period, bicycle accidents were across all Munich
 48 regions, focusing mainly on central locations. The daytime parameter (**Figure 1**) depicts that at night (11
 49 PM – 5 AM), the e-scooter accidents are concentrated near public transport hubs such as Hauptbahnhof
 50 (central station), Karlsplatz (Stachus), Münchner Freiheit, and the city's grandest boulevards such as
 51 Ludwigstrasse and Leopoldstrasse. These areas concentrate on the main city sights and nightlife venues. In



1
2 **Figure 1 Spatio-Temporal Distribution of E-scooter and Bicycle Accidents in Munich (6.19 – 12.21)**

3 the morning, separate accidents were across the city and clustered in the city center at midday and afternoon.
4 Ludwigsstraße was again among the significant incident hot spots in the evening. Bicycle collisions at night
5 and evening were primarily in the city's core. During the day, bicycle accidents increased along the main
6 speed railway line (Stammstrecke) and in eastern and western city parts.

7 The kernel density estimates of hourly and monthly police-reported e-scooter and bicycle accidents
8 in Munich accumulated for the study period are in **Figure 2**. The number of e-scooter crashes in 2021 in
9 Munich has tripled since June 2019, while the bicycle accident rate stayed constant. Due to the COVID-19
10 pandemic, German states imposed a strict lockdown in March 2020. Schools, kindergartens, and borders
11 with neighboring countries were closed, and physical contact with more than one person from outside one's
12 household was prohibited. As a result, there was a decrease in traffic and outdoor recreation activities,
13 which might cause a reduction in police-reported e-scooter accidents during this period. In early May 2020,
14 the lockdown eased, and e-scooter collisions grew. There was a slightly increasing trend in bicycle accidents
15 in March – April 2020 compared to 2021. This might be due to the “bike boom” when bike ridership
16 increased due to the heightened anxiety over public transportation and a surge in exercise (49). Both e-
17 scooter and bicycle accidents peaked from May to October, corresponding to the increased use of
18 micromobility modes in warmer months (50).

19 Most e-scooter crashes were in the afternoon (3 PM – 7 PM) and at night (8 PM – 3 AM), while
20 bicycle accidents peaked in the morning (7 AM – 9 AM) and afternoon (3 PM – 7 PM). June and July 2021
21 distinguished the highest e-scooter accident rates in the afternoon, whereas, in August, there was a distinct
22 e-scooter accident peak between night and early morning (3 AM – 6 AM). There were significantly more
23 bicycle collisions in July 2019 and 2020 than in other months, but in 2021 the number decreased to the
24 level of other months with higher air temperatures. More night-time bicycle accidents happen in summer.
25 38% of all e-scooter collisions occurred on Fridays and Saturdays. On Fridays, e-scooter accidents peak
26 between 4 PM and 8 PM. Nights between Fridays and Saturdays show the highest rate of night-time e-
27 scooter crashes. Bicycle accidents in Munich were evenly distributed during the working days decreasing
28 on the weekends and holidays. On working days, bicycle accidents top in the morning and afternoon, which
29 overlaps with commuting times in Germany (50). No morning peaks are observed on weekends, but more
30 bicycle accidents are during midday and evening hours. Spatial (**Figure 1**) and temporal (**Figure 2**)
31 characteristics of e-scooter crashes depict that the incidents might have happened during trips for recreation,

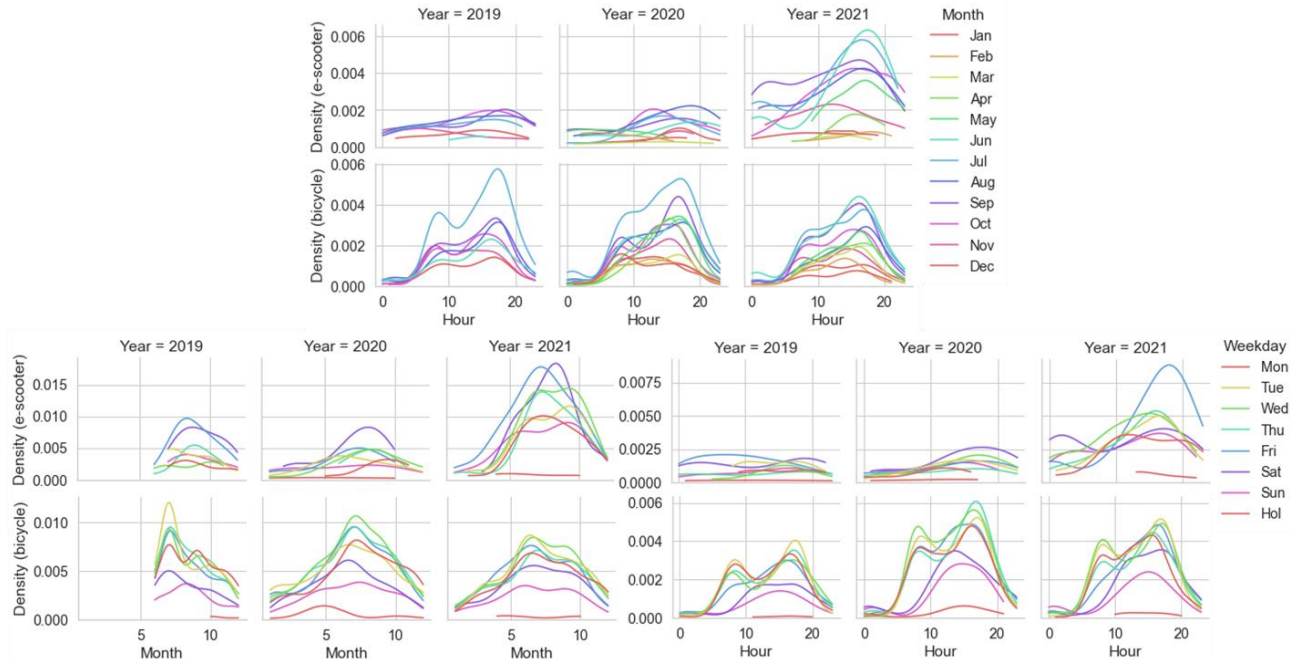


Figure 2 Temporal Distribution of E-Scooter and Bicycle Accidents, June 2019 – December 2021

dining, and going out. Compared to bicycle incidents, there are fewer weekday morning e-scooter crashes associated with commuting times. Most bicycle accidents happen during weekday commuting peaks which could be connected to bike usage.

The correlation between the variables of e-scooter and bicycle crashes gives us insights into micromobility accident patterns (**Figure 3**). Blue cells represent negative correlations: relationships between two variables such that as the value of one variable increases, the other decreases. Red cells are positive correlations that move in the same direction. The intensity of the color represents the intensity of the relationship. The statistical significance can be derived from the matrix with black and beige cells, where beige depicts a significance level (p) less or equal to 5%. Single-person e-scooter and bicycle accidents happen at night (1 PM – 4 PM), on weekends, and on holidays. This might be due to a decrease in traffic flow during this period and an increased probability of lost coordination due to lower visibility or intoxication. On the other hand, more traffic participants are involved in incidents during the midday and afternoon or on weekdays. Furthermore, a slight significant positive correlation is between the number of severely and light injured persons involved in collisions and higher air temperatures. This could be explained by the fact that more participants are involved in the casualties during daylight when the air temperatures tend to be higher.

A significant portion of accidents involving one person is under alcohol. There would be a higher probability of severe injuries if the micromobility driver consumed alcohol or drugs. These statistics confirm that alcohol and drugs affect the ability to concentrate, make sound judgments, and quickly react to situations required for safe driving. The most significant number of intoxicated accidents by e-scooter and bicycle are at night (9 PM – 4 AM). This supports that night is the time with the highest percentage of alcohol-impaired drivers (51). There are relatively more alcoholized accidents involving e-scooters when the air temperature is lower. This might be due to lower temperatures in the evening and night when most alcoholized accidents occur. Collisions are strongly positively correlated with alcohol consumption when other drugs are consumed.

The characteristics of e-scooter drivers and bicyclists were further analyzed (**Figure 3**). Women involved in an accident while riding a bicycle are older than men, which is statistically significant. Female e-scooter riders were slightly younger than male riders, but no statistical significance was identified. Youthful individuals and males commit hit-and-run incidents more often than older people and females.

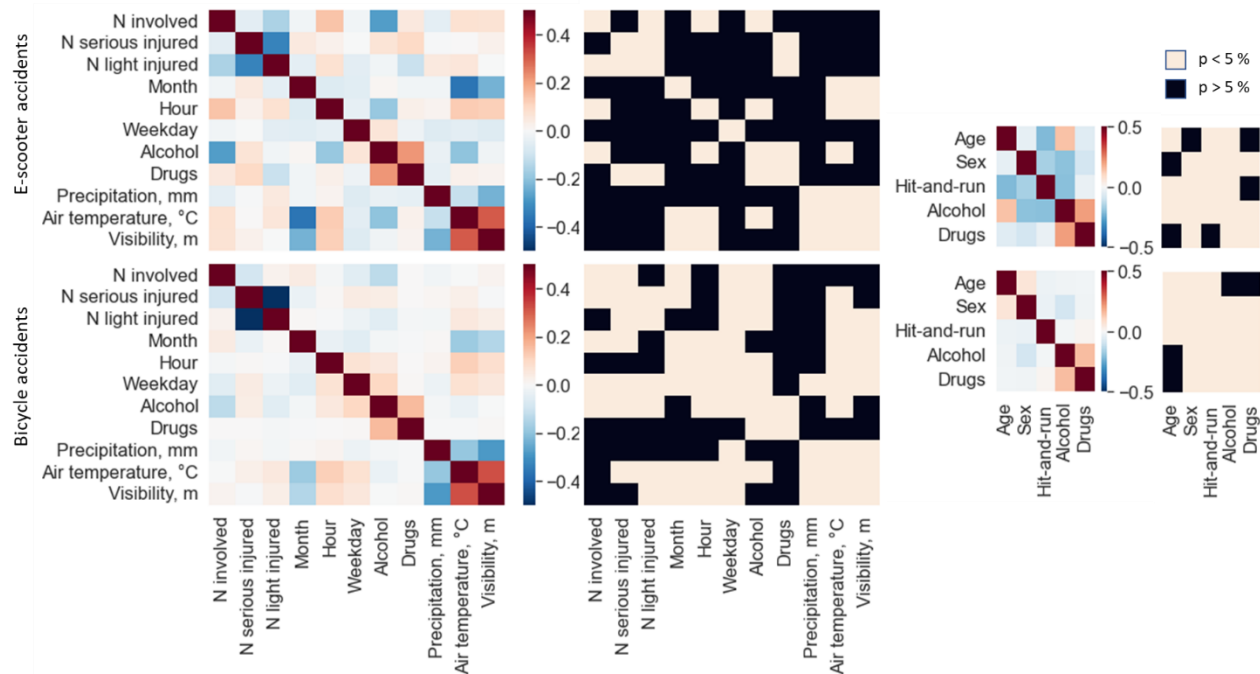


Figure 3 Spearman's Rank-Order Correlation of Accident Characteristics in Munich (6.19 – 12.21)

Other studies confirm that drivers in hit-and-run accidents are likelier than young males (52). The age of e-scooter drivers in alcoholized accidents is higher than in crashes without alcohol consumption. No statistically significant connections between the age of micromobility drivers and drug consumption could be observed. Male e-scooter drivers and bicycles are more often in alcohol and drug consumption accidents than females. The U.S. Department of Health confirms that men are likelier to have been intoxicated in traffic incidents than women (53).

CONCLUSIONS

This study of spatial, temporal, and demographic characteristics of micromobility collisions in Munich over 31 months detected differences and similarities between e-scooter and bicycle crashes. In Munich, the spatial attributes of casualties resemble the literature trend: micromobility incidents tend to occur in downtown areas and central primary roads with many adjacent intersections and mixed land use. When e-scooters emerged on Munich roads in 2019, the accidents were primarily concentrated in the city center. But when the vehicles became more common over time, they sprawled to other regions. Future research could examine incidents on a micro-scale by studying individual hot spots and possible infrastructure inconsistencies. As in other countries in Western Europe, the micromobility incident rates are higher in warmer months when the weather is mild. E-scooter accidents are more common on Fridays and Saturdays, in the evening and night, whereas bike crashes prevail on weekdays in the morning and afternoon. Spatial and temporal distributions of e-scooter crashes depict that the incidents in Munich might have happened during trips for recreation, whereas most bicycle collisions occur during commuting.

Most accident participants are young males. However, on average, bicyclists are older than e-scooter drivers, and the age distribution is more expansive. One-person crashes were more common among e-scooter users than bicyclists. The distribution of serious and light injuries was similar in bicycle and e-scooter incidents. In incidents involving several participants, collisions with vehicles of the same type and cars were the most frequent for both micromobility modes. The percentage of intoxicated casualties and hit-and-run cases was relatively higher among e-scooter users than among cyclists. Analysis of the incidents with drunk micromobility drivers depicted that drunken driving is dangerous: severe injuries and single-person accidents presumably due to lost control are more common when driving intoxicated. The data showed an increased probability of drunk men forcing at night.

1 Policymakers, service operators, and transportation practitioners could benefit from investigating
2 settings, causes, and effects of traffic incidents to be aware of local features and make informed safety
3 regulation decisions. Cities must balance the critical safety aspects: of vehicles, users, and infrastructure.
4 The micromobility vehicles must have the necessary safety and visibility equipment and be regularly
5 inspected. Training might help inexperienced riders learn how to drive micromobility modes in a less
6 threatening environment and under less pressure. Safety awareness campaigns might be essential for
7 introducing mandatory helmet-wearing and resigning from intoxicated driving. Creating a secure
8 micromobility network requires investment and spatial distribution, but it might positively impact the safety
9 of all road users, including pedestrians.

11 **ACKNOWLEDGMENTS**

12 The Centre for Digitisation and Technology Research of the German Armed Forces (dtec. bw)
13 supported this study within the research project MORE – Munich Mobility Research Campus. Furthermore,
14 the authors thank the City of Munich (Dr. Sascha Filimon, Matthias Mueck, and Viktor Goebel) and team
15 red Deutschland GmbH (Hannes Schreier) for their help in collecting comprehensive data on e-scooter and
16 bicycle accidents in Munich, Germany.

18 **AUTHOR CONTRIBUTIONS**

19 The authors confirm their contribution to the paper as follows: study conception and design: M. Pobudzei;
20 data collection: M. Pobudzei, M. Tiessler, S. Hoffmann; analysis and interpretation of results: M. Pobudzei,
21 M. Tiessler, S. Hoffmann; draft manuscript preparation: M. Pobudzei, M. Tiessler, A. Sellaouti, S.
22 Hoffmann. All authors reviewed the results and approved the final version of the manuscript.

REFERENCES

1. Federal Office of Justice. Verordnung über die Teilnahme von Elektrokleinstfahrzeugen am Straßenverkehr (Elektrokleinstfahrzeuge-Verordnung - eKfV) [Internet]. Gesetze im Internet, Bundesministerium der Justiz. 2019 [cited 2022 Apr 13]. Available from: <https://www.gesetze-im-internet.de/ekfv/BJNR075610019.html>
2. Pobudzei M, Wegner K, Hoffmann S. Identifying Vehicle Preferences and System Requirements of Potential Users of Shared Mobility Systems (SMS). 8th Int Conf Veh Technol Intell Transp Syst VEHITS 2022. 2022;13.
3. Sellaouti A, Arslan O, Hoffmann S. Analysis of the Use or Non-Use of E-Scooters, Their Integration in the city of Munich (Germany), and Their Potential as an Additional Mobility System. In: 2020 IEEE 23rd International Conference on Intelligent Transportation Systems (ITSC). 2020. p. 1–5.
4. GDV. E-Scooter Verursachen Hohe Schäden [Internet]. 2022 [cited 2022 May 24]. Available from: <https://www.gdv.de/de/medien/aktuell/e-scooter-verursachen-hohe-schaeden--82764>
5. Trivedi TK, Liu C, Antonio ALM, Wheaton N, Kreger V, Yap A, et al. Injuries Associated with Standing Electric Scooter Use. *JAMA Netw Open*. 2019 Jan 25;2(1):e187381.
6. Oltermann P. Drunk Riding Fuels Call for Oktoberfest Curbs on E-Scooters. *The Guardian* [Internet]. 2019 Aug 6 [cited 2022 May 5]; Available from: <https://www.theguardian.com/world/2019/aug/06/rise-in-drunk-riding-fuels-munichs-call-for-e-scooter-curbs-during-oktoberfest>
7. Störmann P, Klug A, Nau C, Verboket RD, Leiblein M, Müller D, et al. Characteristics and Injury Patterns in Electric-Scooter Related Accidents—A Prospective Two-Center Report from Germany. *J Clin Med*. 2020 May;9(5):1569.
8. Bauer F, Riley JD, Lewandowski K, Najafi K, Markowski H, Kepros J. Traumatic Injuries Associated with Standing Motorized Scooters. *JAMA Netw Open*. 2020 Mar 31;3(3):e201925.
9. Deutsche Welle (www.dw.com). Oktoberfest Ends with Less Beer Drunk, but Plenty of Intoxicated E-Scooter rides | DW | 06.10.2019 [Internet]. DW.COM. [cited 2022 May 24]. Available from: <https://www.dw.com/en/oktoberfest-ends-with-less-beer-drunk-but-plenty-of-intoxicated-e-scooter-rides/a-50716675>
10. Deutsche Welle (www.dw.com). German Police Pull Over Drunk E-Scooter Driver on Autobahn | DW | 26.12.2019 [Internet]. DW.COM. [cited 2022 May 24]. Available from: <https://www.dw.com/en/german-police-pull-over-drunk-e-scooter-driver-on-autobahn/a-51802575>
11. Kleinertz H, Ntalos D, Hennes F, Nüchtern JV, Frosch K, Thiesen DM. Accident Mechanisms and Injury Patterns in E-Scooter Users. *Dtsch Arztebl*. 2021;118:117–21.
12. Ishmael CR, Hsiue PP, Zoller SD, Wang P, Hori KR, Gatto JD, et al. An Early Look at Operative Orthopaedic Injuries Associated with Electric Scooter Accidents: Bringing High-Energy Trauma to a Wider Audience. *JBJS*. 2020 Mar 4;102(5):e18.
13. Shah NR, Aryal S, Wen Y, Cherry CR. Comparison of Motor Vehicle-Involved E-Scooter and Bicycle Crashes Using Standardized Crash Typology. *J Safety Res*. 2021 Jun 1;77:217–28.

Pobudzei, Tiessler, Sellaouti, Hoffmann

14. Ma Q. Data-Driven Operational and Safety Analysis of Emerging Shared Electric Scooter Systems [Internet]. Old Dominion University Libraries; 2021 [cited 2022 May 19]. Available from: https://digitalcommons.odu.edu/msve_etds/65/
15. Uluk D, Lindner T, Dahne M, Bickelmayer JW, Beyer K, Slagman A, et al. E-scooter Incidents in Berlin: An Evaluation of Risk Factors and Injury Patterns. *Emerg Med J*. 2022 Apr 1;39(4):295–300.
16. Meyer HL, Kauther M, Polan C, Abel B, Vogel C, Mester B, et al. E-scooter, E-Bike and Bicycle Injuries in the Same Period - A Prospective Analysis of a Level 1 Trauma Center. *Unfallchirurg*. 2022 Jan 14;
17. Stigson H, Malakuti I, Klingegård M. Electric Scooters Accidents: Analyses of Two Swedish Accident Data Sets. *Accid Anal Prev*. 2021 Dec 1;163:106466.
18. Transform Transport. E-scooter Accidents and the Urban Environment: the Case of Milan [Internet]. 2021 [cited 2022 May 24]. Available from: <https://transformtransport.org/research/innovative-technologies/e-scooter-accidents-and-the-urban-environment-the-case-of-milan/>
19. Weidemann F, Schröder BM, Johannsen H, Christian K, Sebastian D. E-Scooter Crashes: Are They a Risky Underestimated New Mode of Transport? A Medical and Technical Assessment. *Arch Trauma Res*. 2021 Jan 10;10(4):215.
20. Mayhew LJ, Bergin C. Impact of E-Scooter Injuries on Emergency Department Imaging. *J Med Imaging Radiat Oncol*. 2019;63(4):461–6.
21. Wüster J, Voß J, Koerdt S, Beck-Broichsitter B, Kreutzer K, Märdian S, et al. Impact of the Rising Number of Rentable E-scooter Accidents on Emergency Care in Berlin 6 Months After the Introduction: A Maxillofacial Perspective. *Craniofacial Trauma Reconstr*. 2021 Mar;14(1):43–8.
22. Yang H, Ma Q, Wang Z, Cai Q, Xie K, Yang D. Safety of Micro-Mobility: Analysis of E-Scooter Crashes by Mining News Reports. *Accid Anal Prev*. 2020 May 29;143:105608.
23. Bozzi AD, Aguilera A. Shared E-Scooters: A Review of Uses, Health and Environmental Impacts, and Policy Implications of a New Micro-Mobility Service. *Sustainability*. 2021;13(16):8676.
24. Schreier H, Sellaouti A, Tiessler M, Pobudzei M, Hoffmann S, Hager A, et al. Evaluierung der verkehrlichen Wirkungen von E-Tretrollern [Internet]. Landeshauptstadt München; 2022. Available from: <https://muenchenunterwegs.de/content/1423/download/220530-bericht-eva-et-final-web.pdf>
25. Chander V. E-bikes Show a Distinct Pattern of Severe Injuries. *Reuters* [Internet]. 2019 [cited 2022 Jun 2]; Available from: <https://www.reuters.com/article/us-health-ebike-injuries-idUSKBN1YT0MV>
26. Utzman M. The Fate of E-Scooters in Portland [Internet]. 2020 [cited 2022 May 24]. Available from: <https://psuvanguard.com/the-fate-of-e-scooters-in-portland/>
27. Hamilton IA. Electric Scooters Were to Blame for at Least 1,500 Injuries and Deaths in the U.S. [Internet]. *Business Insider*. 2019 [cited 2022 May 24]. Available from: <https://www.businessinsider.com/minimum-of-1500-us-e-scooter-injuries-in-2018-2019-2>

Pobudzei, Tiessler, Sellaouti, Hoffmann

28. Nehra W. Number of E-Scooter Accidents in Berlin More than Doubled in 2021 [Internet]. 2022 [cited 2022 May 24]. Available from: <https://www.iamexpat.de/expat-info/german-expat-news/number-e-scooter-accidents-berlin-more-doubled-2021>
29. Neumann P. E-scooter Accidents Triple [Internet]. Berliner Zeitung. 2021 [cited 2022 May 24]. Available from: <https://www.berliner-zeitung.de/en/e-scooter-accidents-triple-li.178074>
30. Swissinfo. E-scooter Accidents are More Common than Assumed [Internet]. SWI swissinfo.ch. [cited 2022 May 24]. Available from: <https://www.swissinfo.ch/eng/e-scooter-accidents-more-common-than-assumed/47266020>
31. Harbrecht A, Hackl M, Leschinger T, Uschok S, Wegmann K, Peer Eysel KW, et al. What to Expect? Injury Patterns of Electric-Scooter Accidents over One Year - A Prospective Monocentric Study at a Level 1 Trauma Center. *Eur J Orthop Surg Traumatol*. 2022;32:641–7.
32. Deutsche Welle (www.dw.com). Germany: Data Shows E-Scooters to Be Less Dangerous than Feared | DW | 26.03.2021 [Internet]. DW.COM. [cited 2022 May 24]. Available from: <https://www.dw.com/en/germany-data-shows-e-scooters-to-be-less-dangerous-than-feared/a-57011416>
33. Bascones K, Maio Méndez TE, Yañez Siller FA. E-Scooter Accidents: A New Epidemic. *Rev Esp Cir Ortopédica Traumatol*. 2022 Mar 1;66(2):T135–42.
34. Destatis. 2,155 Personal Injury Accidents with E-Scooters in 2020 [Internet]. Federal Statistical Office. 2021 [cited 2022 May 24]. Available from: https://www.destatis.de/EN/Press/2021/03/PE21_N021_462.html
35. Center for Disease Control and Prevention. Bicycle Safety, Motor Vehicle Safety [Internet]. 2022 [cited 2022 Jun 2]. Available from: <https://www.cdc.gov/transportationsafety/bicycle/index.html>
36. Fletcher R. Bicycle Accident Statistics [Internet]. Bohn & Fletcher, LLP. 2022 [cited 2022 Jun 2]. Available from: <https://www.bohnlaw.com/2022/03/08/bicycle-accident-statistics/>
37. Kaloc J. This Is When Most Urban Cycling Accidents Happen [Internet]. We Love Cycling magazine. 2020 [cited 2022 Jun 2]. Available from: <https://www.welovecycling.com/wide/2020/01/30/this-is-when-most-urban-cycling-accidents-happen/>
38. McCarthy. U.S. Experiences Surge in E-Scooter Accidents [Internet]. 2020 [cited 2022 May 24]. Available from: <https://www.statista.com/chart/20507/e-scooter-injury-rate-and-type-of-injuries/>
39. Hall J, Byrnes E, McMahon C, Pontius D, Watts J. Identifying Best Practices for Management of Electric Scooters. 2019 May [cited 2022 May 24]; Available from: <https://kb.osu.edu/handle/1811/87590>
40. Jiao J, Bai S, Choi SJ. Understanding E-Scooter Incidents Patterns in Street Network Perspective: A Case Study of Travis County, Texas. *Sustainability*. 2021 Sep 24;13(19):10583.
41. Allem JP, Majmundar A. Are Electric Scooters Promoted on Social Media with Safety in Mind? A Case Study on Bird's Instagram. *Prev Med Rep*. 2019 Mar 1;13:62–3.

Pobudzei, Tiessler, Sellaouti, Hoffmann

42. Badeau A, Carman C, Newman M, Steenblik J, Carlson M, Madsen T. Emergency Department Visits for Electric Scooter-Related Injuries after the Introduction of an Urban Rental Program. *Am J Emerg Med.* 2019 Aug 1;37(8):1531–3.
43. Cherry CR. 80% of Fatal E-Scooter Crashes Involve Cars: A New Study Reveals Where and Why Most Collisions Occur [Internet]. *The Conversation.* 2021 [cited 2022 May 24]. Available from: <http://theconversation.com/80-of-fatal-e-scooter-crashes-involve-cars-new-study-reveals-where-and-why-most-collisions-occur-158609>
44. Santacreu A, Yannis G, de Saint Leon O, Crist P. Safe Micromobility. 2020 Feb [cited 2022 May 27]; Available from: <https://trid.trb.org/view/1696177>
45. Lipovsky C. Free-floating Electric Scooters: Representation in French Mainstream Media. *Int J Sustain Transp.* 2020;15(10):778–87.
46. Wetter und Klima - Deutscher Wetterdienst - CDC (Climate Data Center) - Klimadaten zum direkten Download [Internet]. [cited 2022 May 17]. Available from: https://www.dwd.de/DE/leistungen/cdc/cdc_ueberblick-klimadaten.html?nn=17626
47. Pydata.org. Visualizing Distributions of data — seaborn 0.11.2 Documentation [Internet]. [cited 2022 Jun 8]. Available from: <https://seaborn.pydata.org/tutorial/distributions.html#tutorial-kde>
48. SPSS. Spearman’s Rank-Order Correlation [Internet]. 2018 [cited 2021 Aug 19]. Available from: <https://statistics.laerd.com/statistical-guides/spearmans-rank-order-correlation-statistical-guide.php>
49. Bernhard A. The Great Bicycle Boom of 2020 [Internet]. 2020 [cited 2022 Jun 21]. Available from: <https://www.bbc.com/future/ bespoke/made-on-earth/the-great-bicycle-boom-of-2020.html>
50. Kamargianni M. Analysing Seasonality of Londoner’s Cycling Patterns and Behaviour [Internet]. *Transportation Research Procedia.* Shanghai, China: Elsevier; 2017 [cited 2022 Jun 21]. Available from: <https://www.sciencedirect.com/journal/transportation-research-procedia/vol/25/suppl/C?page=1>
51. National Highway Traffic Safety Administration. Time of Day and Demographic Perspective of Fatal Alcohol-Impaired-Driving Crashes. *US Dep Transp.* 2011;8.
52. Benson AJ, Arnold LS, Tefft BC, Horrey WJ. Hit-and-Run Crashes: Prevalence, Contributing Factors, and Countermeasures. *AAA Foundation for Traffic Safety;* 2017.
53. U.S. Department of Health & Human Services. Excessive Alcohol Use and Risks to Health [Internet]. 2022 [cited 2022 Jun 22]. Available from: <https://www.cdc.gov/alcohol/fact-sheets/mens-health.htm>