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Life cycle assessment of electric kick scooters: consolidating environmental impact quantification and concluding climate-friendly use options

Corinna Baumgartner^{1*} and Eckard Helmers^{2*}

Abstract

Background The environmental impact of electric scooters has been the subject of critical debate in the scientific community for the past 5 years. The data published so far are very inhomogeneous and partly methodologically incomplete. Most of the data available in the literature suffer from an average bias of 34%, because end-of-life (EOL) impacts have not been modelled, reported or specified. In addition, the average lifetime mileage of shared fleets of e-scooters, as they are operated in cities around the world, has recently turned out to be much lower than expected. This casts the scooters in an unfavourable light for the necessary mobility transition. Data on impact categories other than the global warming potential (GWP) are scarce. This paper aims to quantify the strengths and weaknesses of e-scooters in terms of their contribution to sustainable transport by more specifically defining and extending the life cycle assessment (LCA) modelling conditions: the modelling is based on two genuine material inventories obtained by dismantling two different e-scooters, one based on a traditional aluminium frame and another, for the first time, based on plastic material.

Results This study provides complete inventory data to facilitate further LCA modelling of electric kick scooters. The plastic scooter had a 26% lower lifetime GWP than the aluminium vehicle. A favourable choice of electric motor promises a further reduction in GWP. In addition to GWP, the scooter's life cycles were assessed across seven other impact categories and showed no critical environmental or health impacts compared to a passenger car. On the other hand, only the resource extraction impact revealed clear advantages for electric scooters compared to passenger cars.

Conclusions Under certain conditions, scooters can still be an important element of the desired mobility transition. To assure a lifetime long enough is the crucial factor to make the electric scooter a favourable or even competitive vehicle in a future sustainable mobility system. A scooter mileage of more than 5400 km is required to achieve lower CO₂eq/pkm emissions compared to passenger cars, which seems unlikely in today's standard use case of shared scooter fleets. In contrast, a widespread use of e-scooters as a commuting tool is modelled to be able to save 4% of greenhouse gas (GHG) emissions across the German mobility sector.

Keywords Life cycle assessment, Micro-mobility, Electric kick scooter, Carbon footprint, Environmental impact, Shared fleet application greenhouse gases, Mobility mode, Global warming potential (GWP)

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Introduction

The European Union has declared a "New Deal" to achieve zero carbon emissions by 2050, which explicitly includes the mobility sector [1]. Reaching zero emissions will require enormous efforts. The mobility sector represents the biggest challenge on the road to zero emissions, or the risk of failure, as it is the only sector in Europe that has so far refused to reduce carbon emissions [2].

Micro-mobility is emerging in this situation as a hope to accompany urban mobility into a period of increased sustainability by reducing urban problems such as congestion, lack of space in traffic areas and emissions [3] through the provision of downsized vehicles. SAE [4] defines powered micro-mobility vehicles as (a) fully or partially powered by an engine, (b) with a curb weight \leq 500 lb (227 kg), and (c) with a top speed \leq 30 mph (48 km/h).

This research focuses on electric scooters as an important vehicle in the reign of micro-mobility. However, the term "scooter" is not specific. In an extended classification scheme for micro-mobility vehicles that we have developed, scooters can be found under types 1a, 1b and 3 (Table 1).

This paper focuses on electric vehicles with handlebars, specifically those that are started by kicking/pushing with the foot (hereafter referred to as "e-scooters"), which are included in Group 1b of Table 1. In Switzerland, which provides the main boundary conditions for the LCA modelling, e-scooters are called "Trottinett" (electric and abbreviated: eTrotti).

There is a risk of confounding data from literature sources that do not specifically describe the type of scooter being studied. For example, Chang et al. [6] and Nayak et al. [7] discuss the technological advancement and emissions of 'e-scooters', but this refers to traditional 'step-through scooters' with a seat (vehicle type No. 3, Table 1). New electrified bike-like tricycles (vehicle type 2b, Table 1) have also been modelled for their life cycle emissions (e.g., [8]). However, kick scooters can also have three wheels. The variety of vehicles available today is enormous. Vehicles can change type category (Table 1) due to minor technical variations, also related to different local legislation: for example, a software change can turn a kick-scooter into a step-through scooter (vehicle type 3). Some heavier kick-scooters can easily be fitted with a seat (thus converting them to type 3, Table 1).

In large cities with more than 200,000 inhabitants in Northern America, there were up to 2000 e-scooters in operation per year between 2018 and 2020 according to Badia and Jenelius [9]. The European fleets appear to be larger. Li et al. [10] quantified the fleet sizes in 30 European cities in 2021: on average, there are 4254 scooters per city. Berlin tops the list with 22,948 e-scooters [10]. Extrapolating the number of electric scooters for Europe's 300 largest conurbations [11] gives a figure of over one million. These figures are based entirely on research into shared fleet scooters and not on private scooter use.

Electric scooters as a vision for sustainable transport

Qualitatively, micro-mobility has been associated with a range of positive and negative implications [12]. Kick e-scooters are smartly designed vehicles, because they are light and need little space when driving. In this context, promoting micro-mobility makes sense fundamentally, which is why push and pull strategies need to be developed to increase the uptake of small electric vehicles [13]. E-scooters are seen as vehicles that meet the "last mile" mobility demand [14]. The distances travelled by shared e-scooters are short, averaging 1.81 km, while 13.1 min are spent with a speed of 8.31 km/h, on average [9].

Tab	e 1	Comp	leted (electrifie	d vel	hicle	classif	ication	scheme	(extenc	led,	based	on	[4, 5	5])
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Vehicle type No	Vehicle types	Vehicle subtypes			
0	electrified boards or skates without a han- dlebar	Oa	powered skates (two, separated)		
		0b	hover-board, e-board, unicycles (1–2 wheels)		
		0c	skateboard (4 or more wheels)		
1	electrified vehicles with a handlebar and without a seat	1a	stand-up scooter (e.g., a Segway HT/PT from 2001)		
		1b	kick scooter (here: "e-scooter")		
2	bicycle similar vehicles that can be operated alternatively without the electric engine	2a	e-bike		
		2b	bike-like three- and four-wheelers		
3	electrified larger two- and three-wheelers	step-through scooters, mopeds, motorcycles, and larger three-wheelers (e.g., electri- fied Tuk Tuks). – under micro-mobility definition with a top speed ≤ 30 mph (48 km/h) and a curb weight ≤ 500 lb (227 kg)			
4–6	light four-wheelers, passenger cars, Light commercial vehicles, heavy-duty trucks (for more details, see [5])				

Vehicle types 0-3 are covered by the definition of micromobility. This study focuses on subtype 1b

Many studies have attempted to identify possible mode shifts through e-scooter applications such as scooter sharing. However, the reports are inconclusive and show high variability in user behaviour (reviewed in [15, 16]). Nevertheless, likely scenarios for e-scooter uptake have been suggested. For example, Gebhardt et al. [17] found that 13% of daily car trips, or 2% of car kilometres in Germany, are suitable for substitution.

E-scooters are very light (on average only 20 kg without the rider), which makes them easy to transport and results in high energy efficiency in the use phase—energy consumption of electric vehicles depends mainly on the vehicle weight in all vehicle classes [5]. At 1.46 ± 0.42 kWh/100 km, electric stand-up and kick scooters consume 92% less energy in the use phase than electric cars [5]. Therefore, if e-scooters can replace cars on the "last mile", high energy savings can be realised. However, of the 10,487 e-scooter users surveyed in three French and two US cities, only 18% would have used a car instead of an e-scooter for their trip, while the others would have used further environmentally friendly modes of transport if e-scooters had not been available (reviewed in [18]).

Problems associated with shared scooter fleets

In many cities, however, discarded e-scooters block pedestrian routes and are often sabotaged and thrown into rivers, for example. In the city of Zurich, with a population of around 435,000 in 2020, 137 e-scooters were found in the river Limmat in 2020, after another 37 e-scooters were removed from the Limmat in 2019, when sharing platforms started offering their first e-scooters in Zurich [19]. With 2350 e-scooters in Zurich in 2020, around 7% were destroyed by being disposed of in the city's river in this way [20]. A further analysis of comparable figures published in the press showed that in the German city of Cologne (1.1 million inhabitants), around 900 e-scooters were found in or removed from rivers and ponds in 2020 and 2021 alone [21], which means that around 14% of the 6472 e-scooters ([10], figure for 2021) in Cologne were destroyed in this way, in addition to an unknown number of defective e-scooters that were disposed of elsewhere in both of the above cities.

Provoking deterioration, as for example, fleet operators often do not remove e-scooters from the streets during the night, even in winter nights with freezing temperatures.

E-scooters also come with elevated safety risks followed by partly heavy injures among scooter or other road users [22, 23]. Felipe-Falgas et al. [24] studied the environmental impact of shared e-bikes, e-scooters and e-mopeds in Barcelona. The results were very heterogeneous: some vehicles increased greenhouse gas (GHG) and particulate matter (PM) emissions, while others reduced them. All reduced NO_x emissions compared to passenger car use [25]. Felipe-Falgas et al. [25] also suggested that the ecodesign of micro-mobility vehicles needs to be improved and that they need to be strategically used and deployed as part of a holistic transport policy.

Comparative life cycle global warming potential (GWP) of electric scooters

In contrast to electric passenger cars [26], the GWP of electricity has a comparatively small influence on the total life cycle GWP of e-scooters (in the following referred to as life cycle GWP), according to Moreau et al. [27]. Severengiz et al. [28], on the other hand, reported a clear advantage for the life cycle GWP when the scooters are charged with electricity from wind power instead of the average German net electricity mix. The collection and distribution of scooters by fleet operators (e.g., with diesel vans or cargo bikes) has been attributed with varying impacts on lifetime GWP [29, 30].

However, given the low energy consumption in the use phase, the question arises whether e-scooters are still superior when considering the impacts over the whole life cycle. Specific to electrified vehicles, significant parts of life cycle impacts may belong to the supply chain, such as battery production [26].

Reported life cycle GWP of e-scooters so far shows large variations within the studies published (Fig. 1). This is most of all due to different assumptions when it comes to the lifespan of these vehicles. Whereas mostly temporal lifespans of scooters in terms of months and years are communicated, the LCA analysis behind is based on lifetime mileage assumptions as the vehicles are aging mainly by mileage. Accordingly, the mileages underlying the modelling of the respective literature sources are displayed here in addition (Fig. 1). Fleet operators do not report mileages, making it impossible this way to compare their data. Overall, however, they appear to be similar to the scientific results published up to 2022 (Fig. 1). Operational mileages have a huge influence on the GWP in terms of per g CO₂eq/pkm: extending the base case of 284 days of use (equivalent to 1400 km), as specified by Moreau et al. [23], to 2.5 years (equivalent to 11,520 km) would decrease the GWP from 131 to below 50 g CO₂eq/ pkm (Fig. 1). Severengiz et al. [30, 31] also pointed to a strong influence of lifespan, quantifying impacts for a "6-24 months" use, translated into a kilometre lifespan of 1150-5150 (Fig. 1). Based on even more extended assumptions, only 40 g CO₂eq/pkm would result from a lifespan of 5 years but, respectively, 829 g CO₂eq/pkm in case the scooter is discarded after already 1 month, due to Moreau et al. [27]. However, these authors did not know statistically, how long a scooter survives in a fleet.



Fig. 1 Compilation of life cycle GWP of e-scooters and further passenger traffic modes in g CO₂eq per passenger kilometre (pkm) (in red: lifetime mileages of the e-scooters modelled in the respective study). EOL: end-of-life treatment. Electric bicycle data compiled from Weiss et al. [32], Mellino et al. [33], Moreau et al. [27], and Huang et al. [34]. Electric bus data from Helmers et al. [35]. Combustion engine car, lower estimate: mini-size car, higher estimate: mid-size car. Cars modelled with 1.57 persons/car, end-of-life (EOL) modelling based on avoided burden approach [35]. The lower estimates for an electric passenger car are based on a mini-class BEV (battery electric vehicle) operating a 14-kWh battery plus a secondary battery use. The higher estimates for electric passenger cars are based on a mid-range car (52 kWh battery), and without a secondary battery use. All electric cars are charged with reasonable green electricity mix during the use phase (130.6 g CO₂eq/kWh, [35]). Conventional city bus data reviewed in Helmers et al. [35]. E-scooter fleet operator's data from VOI (35 g CO₂eq/pkm, [36]), BIRD (97 g CO₂eq/pkm, [37]), and LIME, respectively: 165 g CO₂eq/pkm [38], but related mileages were not reported (light blue column). Dotted red lines: extrapolation of the modelling of this study to the mileages reported by Reis et al. [39]. Dashed column at the bottom: extrapolation of modelling results from Reis et al. [39] to the mileage assumptions from previous studies

The problem is that a prolonged use about 1–2 years would require a high level of repair activity: economically, it seems rather unlikely that fleet operators invest a lot of efforts in repairs: when ordering thousands of items from e-scooter manufacturers, fleet operators receive a scooter for about 50% of the typical consumer prices between €200 and €1000 (according to an overview on Amazon Germany in December 2023). On top of that, while a private owner receives a 24-month warranty, this is excluded in rental applications. Almost any repair could exceed the replacement cost of 100–500 € for the fleet operator. All this points to (much) shorter periods of use in reality than the up to 24 months (corresponding to 10,000 km of mileage) suggested in reports published between 2019 and 2022 (Fig. 1).

More recently published LCA data can partly be understood as a variation of the above modelling conditions: for example, Ishaq et al. [40] applied the material inventory of Hollingsworth et al. [29] but increased the e-scooter mileage by 1.5 times and, unlike Hollingsworth et al. [29], consider up to "50% use of the recycled aluminium". As would be expected, this significantly reduces the life cycle GWP of the e-scooter from 88 g CO₂eq/pkm [29] to 21 g CO₂eq/pkm [40]. Extending the lifetime of an e-scooter also depends on whether the battery is replaceable or not [30]. In the early years, scooter batteries were not swappable, so the entire vehicle was wasted after battery failure (the first e-scooter with swappable battery has been introduced in 2019, see Intelligent transport [41]. Finke et al. [42] added the impacts of swappable batteries and self-service battery swapping stations, but also found system-wide emissions of $60-110 \text{ g CO}_2\text{eq/pkm}$, which is in the order of magnitude of the previous results (Fig. 1).

Moreau et al. [27] reported that in their base case application (284 days of scooter use, corresponding to 1400 km of driving, resulting in 131 g CO_2eq/pkm), the GWP of transport activity increases due to the use of e-scooters (Fig. 1). However, Moreau et al. [27] also modelled up to 8 times higher mileages for shared e-scooters (Fig. 1), which seems doubtful given the often poor treatment, such as the fact that many shared e-scooters are left outside for long periods.

These doubts turned out to be justified when the study of Reis et al. [39] was published, changing the picture. Reis et al. [39] for the first time were able to apply realworld mileage/lifetime experiences from an e-scooter fleet in Lisbon (Portugal). Vandalism and high defect rates resulted in an average lifetime of only 1.5 months in Lisbon. Combined with an average mileage of 2-5 km/day, this ended up in a lifetime mileage of only 90-225km and a resulting footprint of $800-1700 \text{ g CO}_2\text{eq/pkm}$ (Fig. 1). Reis et al. [39] extrapolated their modelling to higher mileages published by earlier authors (Fig. 1), this way resulting in a minimum impact of 112 g CO_2eq/pkm (Fig. 1). On the other hand, less favourable assumptions increased emissions to 5300 g CO_2eq/pkm for the Lisbon scooter fleet [39]. Although Reis et al. [39] emphasised that the Lisbon application case is an unusually rough one (due to the many steep hills in the city), the question arises whether the previously published impacts (Fig. 1) may have been (much) too optimistic due to the lack of reliable scooter survival data.

All e-scooters modelled so far have been based on an aluminium chassis. Ishaq et al. [40] theoretically discussed several alternative materials. Knowing that aluminium has a high GWP, some fleet operators argue to use up to 99% recycled aluminium [36]. However, removing recycled aluminium for the benefit of e-scooters will result in a shortage of this material at another place. Therefore, this is not a general solution to achieve lower impacts.

The electric scooter industry relies heavily on aluminium as a chassis material: a review of electric scooters (subtype 1b, see Table 1) offered on the Amazon Germany platform on 23 March 2024 found that 76 out of 84 different electric scooters had an aluminium frame (scooters for adults considered only). A further 3 had a steel frame and for 5 of the 84 scooters offered, the frame material was not specified. None of the scooters offered had a plastic frame. All electric scooters offered had only 2 wheels.

Surprisingly, literature sources often did not specify the end-of-life (EOL) choice applied during LCA modelling [29, 43, 44], did not consider recycling credits [31, 45, 46], or excluded EOL treatment from modelling [23], making these sources difficult to use for comparison. Reis et al. [39], in contrast, modelled EOL choices as a particular sensitivity. E-scooter fleet operators have also considered recycling credits (e.g., [36]) during LCA modelling. However, due to the lack of reported lifetime mileage, their data [36–38] cannot be seriously compared and are displayed for information only, see Fig. 1.

Purpose of this study

In conclusion, the reported life cycle GWP of e-scooter passenger km travelled, exhibits very heterogenic results. Reported emissions are mostly similar to those of conventional (combustion engine based) transport modes such as cars and buses, and in some cases even higher than those of passenger cars (Fig. 1). Electric bicycles, for example, look more favourable with only 14–26 g CO₂eq/ pkm (Fig. 1). The recent publication of Reis et al. [39], however, shifted the impact of shared e-scooters very much into an unfavourable region of up to 1700 g CO₂eq/ pkm and more. This situation is very unsatisfactory,

which is why this study investigates measures and factors that enable a reduction in the lifetime emissions of the scooters by applying a cradle-to-grave LCA.

Firstly, missing credits due to recycling indicate a possible overestimation of impacts to date: six out of eight LCA reports do not specify or quantify EOL (Fig. 1). This modelling is designed to carefully assess EOL credits to change the picture.

Another approach to reduce the impact of e-scooters may be the choice of the main material. So far, there are no published LCA data on e-scooters with a chassis material other than aluminium, so the optimisation potential in changing the main material is unknown. This paper therefore compares the life cycle impacts of two different electric scooters with chassis made of different materials (plastic and aluminium).

This study also aims to determine a minimum mileage for the scooters to be advantageous in terms of the GWP compared to passenger cars.

In addition, data on life cycle impacts of e-scooters other than related to the GWP are very scarce. This study therefore attempts to enrich this knowledge by evaluating the impacts of the two e-scooters in about 7 more midpoint and endpoint-related environmental impact categories in order to reveal potential burden shifting. Another new feature of this study is that the impacts of e-scooters are compared directly with those of passenger cars across all impact categories analysed.

This modelling will result in GWP impacts for e-scooters that are valid for a shared fleet application and are therefore compatible with existing literature data. However, as there is still uncertainty about the life expectancy of e-scooters in a shared fleet, this study prefers to determine the potential benefits in terms of reduced GWP of a private e-scooter application for commuting purposes.

Methodology of the life cycle assessment (LCA)

As this study follows the main principles and steps (without critical review) of ISO 14040 [47], it is also based on the structure of goal and scope, life cycle inventory (LCI) analysis, impact assessment and interpretation including transparent documentation.

Goal and scope

Two different e-scooters are assessed and compared in terms of their environmental impact: an aluminium-based e-scooter (Al e-scooter) and a plastic-based e-scooter (plastic e-scooter), which differ mainly in terms of the frame material (aluminium and plastic) and the collection and distribution during their use phases. The plastic e-scooter can drive autonomously via a telematics system and three wheels. More detailed information on the e-scooters in this study can be found in the respective Chapter 2.2 and in the Additional file 1. More details on autonomous e-scooters can be found in the literature ([48-50]).

System boundary for both e-scooters

The system boundary of the LCA covers a cradle-to-grave life cycle with a system extension for recycling of the two main materials (aluminium and plastic) for both e-scooters, as shown in Fig. 2. It includes the production and transport of materials and components, the use of the e-scooters including transport, collection and distribution, charging and maintenance, and the end of life (EOL) including recycling or other waste treatment options for the materials used. Although the bill of materials (BOM) was based on own weighting for the Al e-scooter and on a manufacturer's BOM for the plastic e-scooter, no solid data was available on the final assembly of the e-scooters and its production effort (see "limitations of this study" below). Therefore, this stage was excluded from this study.

Functional unit for both e-scooters

The functional unit (FU) of this study is the distance travelled by a passenger with a reference flow of one passenger-kilometre (pkm) for both e-scooters, in accordance with the standard FU for passenger transportation.

Lifetime and mileage scenarios

This study analyses three different lifetimes: 6, 12, and 24 months (6M, 12M and 24M) based on the lifetimes reported in the literature (see the lifetime discussion in the introduction). The average travel distance per day and e-scooter is 15 km according to the producer and operator of the shared plastic e-scooter. This information is based on usage data in Singapore where the company Floatility operated a fleet of shared scooters with 6 trips/ day, 2.5 km/trip [51, 52]. Assuming 360 days of operation and 5 days of out of service due to maintenance within a fleet operation, this daily travel distance results in 2700 km travelled for 6M, 5700 km for 12M, and 10,400 km for 24M lifetime for both e-scooters. For comparison, the much shorter average mileage reported by Reis et al. [39] was modelled in addition (Fig. 1).

Impact assessment methods

Two different impact assessment methods were chosen for comparing the life cycle impacts of both e-scooters:



Fig. 2 System boundary for the life cycle assessment of the Al and plastic e-scooter's life cycles, including relevant life cycle stages, related processes, input and output materials, and emissions

- "IPCC 2013 Global Warming Potential (GWP) 100a v1.03", which presents results in kg CO₂eq/pkm [53].
- "ReCiPe 2016 Endpoint (H) v1.03 / World (2010) H/A" with its subcategories and corresponding units in brackets [54]:
 - a. Human Health (DALY/pkm),
 - b. Ecosystems (Species*yr/pkm),
 - c. Resources (USD2013/pkm).

To compare with e-scooters from literature and passenger cars (ICEV=internal combustion engine vehicle, BEV=battery electric vehicles) midpoint indicators from *"ReCiPe 2016 Midoint (H) v1.03/World (2010) H" and "ILCD 2011 Midpoint+v1.10/EC-JRC Global, equal weighting*" were additionally selected [54, 55]:

- *Fine particulate matter formation* (kg PM_{2.5}eq/pkm) from *ReCiPe*,
- Terrestrial acidification (kg SO₂eq/pkm) from ReCiPe,
- *Human carcinogenic* and *non-carcinogenic toxicity* were combined by addition to "*human toxicity*" (kg 1.4-DCB/pkm) from *ReCiPe*,
- Photochemical ozone formation (kg NMVOCeq/ pkm) was taken from *ILCD*.

Life cycle inventory (LCI)

The life cycle inventory was modelled using SimaPro v9.1.1.1 [56] and ecoinvent v3.5 [57]. For modelling the processes, unit (U) processes and the Allocation-at-point-of-substitution (APOS) model was chosen to account for potential recycling options in the EOL phase. The LCI is described in the following sections, the details are provided in Additional file 1: Tables S1–S3. The LCA model was compiled for Switzerland as a use case.

Production phase

The Al scooter's chassis is made primarily of aluminium and is not easily dismantled or repaired. In contrast, the plastic e-scooter's main material is polyamide PA6, commercially known as Ultramid[®] B3, and is designed to be modular for facilitating repair. Furthermore, the plastic e-scooter has three wheels for improved stability and the ability to drive autonomously to a central loading and maintenance station.

The life cycle inventory (LCI) for the Al e-scooter was based on dismantling and weighing its materials and components. This was done for the specific e-scooter VMAX R25, which weighs 16.31 kg, within a pre-study [58, 59]. The LCI for the plastic e-scooter was based on the Floatility efloater, weighing 17.23 kg. Material and component data were obtained directly from the producer and operator [51, 52].

The materials and components for both e-scooters were modelled, including the respective processing data for each material from ecoinvent 3.5 for the LCI. While detailed data was available for the main production locations of single materials and components for the plastic e-scooters (Singapore, Japan, Thailand, Indonesia and China), global (GLO) or rest of world (RoW) market data sets from ecoinvent 3.5 were mainly used for the Al e-scooter modelling in order to account for the average transportation of materials and components. However, for certain materials and components of the Al e-scooter, production was assumed to take place in China. As a results, Chinese data sets were used and modelled where applicable and appropriate.

Detailed information on materials, components, weights, transportation distances and assumptions as well as corresponding ecoinvent processes for both e-scooters, can be found in Additional file 1: Tables S1–S9.

Use phase

The use phase of both e-scooters includes transportation to their destination in Europe, electricity demand for charging and efforts for collection, distribution and maintenance.

The Al e-scooter is assumed to be transported from China, while most of the plastic e-scooter components are shipped from Jakarta, Indonesia to Europe. Only a few parts are transported from Poland or Germany to the assembly location in Hamburg, Germany. Transportation within Europe is done by lorry.

The Al e-scooter has an electricity consumption of 1.576 kWh/100 km, based on its 20.1 km range and a Li-Ion battery capacity of 316.8 Wh [58]. The range of the Al e-scooter was evaluated by measuring the average of three test drives without standard conditions in a pre-study [58]. Standardised drive conditions for e-scooters have not yet been defined [5] but are the subject of recent research [60]. The plastic e-scooter has a similar electricity consumption of 1.4 kWh/100 km (range: 20 km) (data source: Floatility GmbH [51, 52]). The electricity consumption during the use phase was modelled using a Swiss electricity mix with 105 g CO₂eq/kWh [57]. Please refer to Tables S3 and S7 in the Additional file 1 for further process details. According to Severengiz et al. [30], a transportation distance of 1 km per day per e-scooter is assumed for collection and distribution by vans. The lifetime (in months) and related mileages are based on the distance travelled for collection and distribution per day

as well as on the e-scooter's own operating distance of 15 km per day.

As the plastic e-scooter is capable of autonomous driving, the collection and distribution of the plastic e-scooter to a charging station is assumed to be performed without a collection by vans. Therefore, only the additional electricity demand for the autonomous driving is accounted for in the LCI. For this, the electricity demand of 1.4 kWh/100 km was considered as well as the assumption that the e-scooter needs to travel 2 km to the next charging station autonomously per 20 km of battery range, which leads to an electricity demand for collection of 1.4 Wh/pkm, equivalent to only 0.15 g CO_2eq/pkm based on the above Swiss electricity mix.

A simplified approach was chosen for maintenance efforts on plastic e-scooters, with 1% of the e-scooter itself requiring maintenance and replacement within 6 months. For lifetimes of 12 and 24 months, maintenance was assumed to increase linearly.

The maintenance efforts for the Al e-scooter were modelled using different approaches for different materials. The assumptions can be found in Additional file 1: Table S7. The LCI of the e-scooter's use phase is reported in Additional file 1: Table S3.

End-of-Life (EOL) phase

The LCI modelling for the EOL of both e-scooters was based on assumptions or a specific disposal scenario. The only information provided by the producer was that the main chassis material (Ultramid $B3^{(0)}$) of the plastic e-scooter is recycled [51].

For both e-scooters, a recycling rate of 90% has been assumed for their main materials, aluminium and plastic (Ultramid B3[®]). Both recycled materials were modelled using the avoided burden approach. Therefore, a credit with primary material was given according to the recycling rate of the main materials for both e-scooters. The remaining 10% is modelled to be landfilled (refer to Additional file 1: Tables S5 and S8). The recycling rates and EOL treatment options for all other components and materials were adopted from available ecoinvent processes applied. Additional details for the LCI of the EOL can be found in Table S5 for the plastic e-scooter and Additional file 1: Table S8.

Results and discussion

Comparison of the Al and the plastic e-scooter, influence of lifetime mileage and EOL choice

Figure 3 depicts the life cycle impacts of both the aluminium and plastic e-scooters, covering a wide range of operating life cycles, as is usual in published reports. The impacts related to pkm decrease inversely

proportional to mileages, as already described (Fig. 1). The high dependence of the impacts on the lifetime mileages of the e-scooters is due to the dominance of production relative to the use phase impacts as shown in Fig. 3. Although we refrain to recommend a shared fleet application of e-scooters in the conclusion, we have also modelled the GWP (IPCC, 100a) for the very low lifetime mileage reported by Reis et al. [39] as one central estimate from a fleet application in Lisbon: 225 km. This highlights the impact of mileage as a sensitivity and allows for evaluation of the comparability of Reis' modelling with ours. Reis et al. [39] reported a GWP of approximately 800 g CO₂eq/pkm, while our modelling resulted in a GWP of 640 g CO₂eq/pkm for the Al e-scooter and 540 g CO₂ eq/pkm for the plastic scooter, respectively, based on a lifetime mileage of 225 km (see Fig. 1). Although Reis et al. [39] considered various variables, this suggest that both LCA models are comparable. This confirms that e-scooters with such a short lifetime are far from being competitive with alternative mobility modes (Fig. 1).

The Lifetime mileages of e-scooters also strongly affect the impacts on human health, ecosystem, and resources, the comprising endpoints of the ReCiPe LCIA methodology (Fig. 3). Results from these three endpoint impacts were so far reported by de Bortoli [43] only, but without specifying which EOL method was used.

Figure 3 shows that EOL modelling has a significant impact: the credits received when e-scooters materials are returned to the supply chain are high; ranging from 26% to 41% of the life cycle impacts during production plus use phase, as shown in Fig. 3. Recycling yields high credits, particularly for the GWP of the e-scooters (Fig. 3A): material recycling compensated for 34.1-40.6%of the GWP of the Al scooter, and 26.5-29.0% of the GWP of the plastic scooter (6-24 months of use each), for production plus use phase. Based on the medium usage time/mileage (12 months, or 5400 km of mileage), recycling compensates for 38.2% of the production and use phase GWP of the Al scooter, and 28.1% of the production and use phase GWP of the plastic scooter, respectively. These recycling compensations correspond with the findings of Reis et al. [39], who report of 40-52% compensation through recycling credits, depending on the specific EOL scenario. Reis et al. [39] included multiple materials compared to one main material for the avoided burden approach, resulting in a slightly higher compensation compared to the findings of this study.

The plastic e-scooter generally exhibits smaller use phase impacts as shown in Fig. 3 due to its self-driving capability. This capability has been incorporated into the construction of this e-scooter by Floatility [51], but it is



Fig. 3 Comparative environmental impacts of the aluminium scooter (AI e-scooter) and the plastic e-scooter based on 6, 12, and 24 months of use, equivalent to 2700, 5400, and 10,800 km of mileage (shared fleet application). Material recycling credits indicated in grey columns. Cradle to cradle impacts (EOL: substitution), overall results depicted by red lines. A IPCC GWP over 100 years. B Summarized human health impacts. C Summarized ecosystem impacts. D Summarized resources impacts (mineral and fossil resource scarcity). A Life Cycle midpoint, B–D endpoints

not specific to the chassis material, whether it is made of aluminium or plastic.

The plastic scooter, despite having three wheels instead of two generally has lower lifetime impacts than its aluminium chassis counterpart (Fig. 3). The only exception is the 6 months human health impact of the plastic e-scooter, which is 2.7% higher than that of the aluminium e-scooter (Fig. 3). The GWP impact of the plastic e-scooter is 24.9% lower than that of the aluminium e-scooter, based on the medium and most probable operation length of 12M (5.400 km). The Al scooter causes $38.2 \text{ g CO}_2 \text{eq/pkm}$, while the floatility scooter emits 28.1g CO₂eq/pkm, respectively, resulting in a 26% reduction (each modelled for a 12-month = 5.400 km-application). Similarly, the human health impact, the ecosystem impact, and the resources impact of the plastic e-scooter are 1.7%, 16.4% and 12.9% lower, respectively, compared to the Al e-scooter (Fig. 3).

Life cycle impacts inventory breakdown

Figure 4 analyses which inventory components of both the plastic and the aluminium scooter are dominating the lifetime impacts, which were in total depicted in Fig. 3. As shown in Fig. 3, GWP, followed by three endpoint evaluations were modelled: summarized human health and ecosystem impacts, and resources impacts (mineral and fossil resource scarcity).

The plastic scooter's material inventory is known in more detail. However, not all parts could be depicted in the cake charts. The 'remaining' parts (7.6-11.4% in Fig. 4) consist of Cellasto[®] foam, brake cable, Ultramid[®] B3WG13 plastic, Elastollan® (Thermoplastic Polyurethane), a copper solenoid, a magnet, cables, transportation from the factory, maintenance and repair, and partly the throttle (Fig. 4). The impact of the aluminium e-scooter is dominated by the chassis material aluminium across all four impact categories, accounting for 50.5-67.9% (Fig. 4). Although the plastic scooter also contains aluminium, its impact is only around 3.4–7.7% (Fig. 4). The plastic material of the scooter chassis (Ultramid[®], made by BASF), the battery, the motor, and rubber account for half of the impacts during the production and use phase of the plastic scooter (Fig. 4). In terms of absolute numbers, the production of the Al chassis results in 2.3 times more CO_2 eq emissions than the Ultramid[®] chassis, 5.6 times more impact on human health, 4.1 times more impact on the ecosystem, and removes 1.5 times more resources. Therefore, to reduce the impact of the production phase of e-scooters, the first step should be to replace the Al chassis with plastic materials, which is much more environmentally efficient. The choice of electric motor has a another significant impact on the environment. Depending on the country modelled for production and use phases (Sweden or USA), there may be up to 23% optimization potential [61]. Similarly, the type of battery selected can also affect environmental friendliness, although differences in impacts from varying battery chemistries appear to be small [62, 63].

The power consumption impact of the two e-scooters has already been optimised, as modelled here: Our model utilized relatively 'green' Swiss electricity with 105 g CO_2eq/kWh (electricity, low voltage {CH} market for APOS, U), minimizing the use phase impacts (Fig. 3) and share of the electricity impacts (Fig. 4). Regarding the use of scooters in Germany (as shown in the private use case model below), German customers have the option to purchase renewable electricity, which has a carbon footprint comparable to that of Switzerland [35].

The two different e-scooters modelled have a very similar electricity consumption of 1.4–1.5 kWh/100 km. However, the collection & redistribution impact of around 2 g CO₂eq/pkm for the Al e-scooter is added to the electricity consumption impact (for the plastic scooter this amounts to 0.15 g CO₂eq/pkm only). The respective percentages of the two e-scooters (electricity vs. electricity & collection) are still quite similar, with a difference of only up to 1.4 percentage points, except for the resource impact (Fig. 4).

Analysis of further impact categories

Figure 5 displays the life cycle impacts of e-scooters, excluding GWP. The following questions are posed:

- Closing knowledge gaps regarding further impacts: are e-scooters critical in selected impact categories as it is typical for electric cars compared to combustion engine cars (e.g., [35])?
- Is there congruence with previously published e-scooter impact data? These, however, are very scarce so far. In addition, impact categories often have different units, which prevents a direct comparison.
- How do e-scooters perform in further impact categories compared to passenger cars?
- Are there any differences between the two chassis materials (aluminium and plastic)?

The life cycle impacts of the two e-scooters (plastic + aluminium) were modelled and compared to those of passenger cars (Fig. 5). In a previous study comparing electric and combustion engine passenger cars, both technologies showed similar impacts on particulate matter formation and terrestrial acidification [35]. However, the BEV had a lower impact on photochemical oxidant formation and a higher potential for human toxicity [35]. When comparing the environmental



Fig. 4 Share of specific materials and stages of the total global warming potential and three endpoint impact categories (modelling based on 12 months of use equivalent to 5400 km of mileage, EOL credits not considered), shared fleet application. Ultramid[®]: plastic material from BASF. PC: polycarbonate; PE: polyethylene. HD: high density

1			(2022) USD 2000*	BEV Dirnaichner et al.	
resources	-		ICEV Dirnaichner et al. (2022) USD 2000*		
10E-3 \$/pkm		_	e-scooter de Bortoli (2021) USD		
			this plastic e-scooter USD 2013		
			-scooter USD 2013	study Ale	
ecosystem damage			BEV Dirnaichner et al. (2022 BEV)*		
10F-10 species/v nkm		1.1	et al. (2022 ICEV)*	ICEV Dirnaichner	
iot io species/y pki			r de Bortoli (2021)	e-scoote	
		-	plastic e-scooter	this	
			Al e-scooter	study	
house a backt		1	hner et al. (2022)*	BEV Dirnaic	
numan neaith	hu		hner et al. (2022)*	ICEV Dirnaic	
10E-7 DALY/pkm			r de Bortoli (2021)	e-scoote	
		-	plastic e-scooter	this	
		-	Al e-scooter	study	
addification			BEV		
			ICEV		
10E-4 kg SO ₂ eq/pkm			worth et al. (2019)	e-scooter Hollings	
		-	plastic e-scooter	this	
			Al e-scooter	study	
particulate matter			BEV		
10E-5 kg PMeg/pkm			ICEV		
10L-3 Kg HW2.5eq/ pKill			er VOI (EY 2020b)*	e-scoote	
			oreau et al. (2020)	e-scooter M	
			worth et al. (2019)	e-scooter Hollings	
			plastic e-scooter	this	
			Al e-scooter	study	
ical oxidant formation	photochem	-	BEV		
kg NMVOCea/pkm	10E-4		ICEV		
0		<u>.</u>	er VOI (EY 2020b)*	e-scoote	
			plastic e-scooter	this	
			Al e-scooter	study	
human toxicity			BEV		
10E-1 kg 1.4-DCBea/pkm			ICEV		
,,,,,,,, _		-	plastic e-scooter	this	
			Al e-scooter	study	

Fig. 5 Further life cycle impact categories of the two electric scooters modelled in this study (Al e-scooter: aluminium scooter, and the plastic e-scooter, respectively) in comparison with literature data and passenger cars (ICEV: internal combustion engine vehicle; BEV: battery electric vehicles). Results for three endpoint categories (resources, ecosystem damage, human health) presented followed by results from four midpoint categories. Dark colours: this study, light colours: comparative literature and passenger car figures. Results are shown in passenger kilometre (pkm). *) = Individual values or averaged values taken from the literature, which are shown in a wider format for better readability. Minimum and maximum of the e-scooters in this study modelled for 6 and 24 months of use each (= 2700–10,800 km of mileage, higher mileages cause smaller impacts in per pkm). Comparative data for passenger car impacts (specified as "BEV", battery electric vehicle, and "ICEV": internal combustion engine vehicle) were taken from Helmers et al. [35, 64], the minimum each based on a mini size car (SMART), the maximum based on a midsize car (VW Caddy), respectively, modelled with use phase electricity of 130 g CO₂eq/kWh, for all other modelling and inventory parameters see Helmers et al. [35, 64]. Passenger car human toxicity data based on ReCiPe 2016 Midpoint (H) V1.03 / World (2010) H modelling. Human carcinogenic and non-carcinogenic toxicity summarized. ICEV human toxicity minimum and maximum based on small-to-large-sized petrol cars. BEV human toxicity impacts based on the global standardized electric car (result: 0.44 kg 1.4-DCB/pkm shown enlarged). All passenger car pkm data calculated based on 1.57 persons/car (data sources see [35]). Further passenger car endpoint data were taken from Dirnaichner et al. [65]. Smallest columns are based on single data points each [36, 65]. PM₁₀ data for passenger cars (BEV, ICEV) taken from Helmers et al. [35, 64], and converted to PM_{2.5} based on the factor 0.599 taken fr

impacts of operating a passenger car to that of an e-scooter, it is revealed that the results for both types of vehicles are in the same order of magnitude or even similar in 4 of the impact categories modelled, namely ecosystem damage, human health, acidification potential, and photochemical ozone formation (Fig. 5). This may come as a surprise, as scooters are much lighter than cars. However, this is consistent with the GWP analysis (Fig. 1). According to Helmers et al. [35], passenger cars are typically modelled for lifetime mileages of 100,000 to 200,000 km, which can result in more favourable impacts per passenger-kilometre. Nevertheless, the human toxicity impacts of both e-scooters (averaged) are 43% lower than caused by the battery electric passenger car. Reis et al. [39], as for example, also quantified human health impacts (in another unit); however, did not compare them with passenger cars directly.

As expected, e-scooters consume significantly less resources than passenger cars. On average, the aluminium and plastic e-scooters consume only 20% of the resources per passenger kilometre (pkm) compared to an Internal Combustion Engine Vehicle (ICEV), and 24% of the resources consumed by a Battery Electric Vehicle (BEV) per pkm (Fig. 5). In contrast to the observed advantage in human toxicity, our modelling reveals that e-scooters emit 45% more $PM_{2.5}$ on average than passenger cars (Fig. 5).

Only three scientific literature reports so far deliver e-scooter LCA data in additional environmental impact categories and quantify them in units compatible with the ReCiPe characterisation method (see Fig. 5). When considering the impacts on ecosystem damage, human health, acidification potential, and particulate matter emissions, the data reported by de Bortoli [43], Hollingsworth et al. [29], and Moreau et al. [27] appear as outliers in the overall picture (see Fig. 5). Once again, this is probably due to the neglect of EOL impacts: Hollingsworth et al. [29] did not specify the end-of-life (EOL) choice applied in modelling, de Bortoli [43] did not consider recycling credits and Moreau et al. [27] excluded EOL treatment from modelling, which may have led to an overestimation of the reported results. However, the resource extraction impact reported by de Bortoli et al. [43] does not appear as an outlier (Fig. 5).

In terms of material comparison between aluminium and plastic, both modelled e-scooters showed similar impacts on resource consumption, ecosystem damage, human health, and acidification (see Fig. 5). However, the e-scooter with an aluminium chassis had significantly higher impacts on photochemical oxidation formation compared to the plastic counterpart, while the plastic e-scooter had higher impacts on human toxicity costs (see Fig. 5).

For the first time, this overview presents a direct comparison of the environmental impacts of passenger cars and e-scooters across a wider range of impact categories. To sum up these results: although e-scooters are not outperforming passenger cars in terms of environmental impacts currently, it is important to consider the resources saved by using e-scooters (Fig. 5). Therefore, they should not be dismissed as a viable mobility option.

Modelling GWP advantages during a personal e-scooter use for commuting purposes

As the fleet use of e-scooters has apparently not yet achieved proven environmental benefits, this remains to be examined for private use. Such an examination is carried out below.

Taking Germany as an example due to better data availability, statistics reveal 16.9 million employees in 2021 who commuted an average of 16.9 km each workday [67, 68]. In 2020, 68% of employees commuted to work by car, despite over 90% of German residents living within 600-1200 m of a bus or train stop with at least 20 daily departures [69]. For our modelling, we have expanded this distance to approximately 2 km to a bus or metro station for both the individuals' residence and their workplace in another city location. This distance, as already much shorter distances, are too long to walk (four times a day, as shown in Fig. 6), and thus provoking car use for the total distance to and from the workplace. However, with an e-scooter, these individuals could switch to a mixed e-scooter/public transport service scheme (Fig. 6). The commuter could use an e-scooter for the 4×2 km/day to reach the bus/train station and then carry the e-scooter (almost all models offered on the market are collapsible) while travelling in the bus or metro train (Fig. 6). After leaving the bus or metro station, the commuter could cover the last 2 km to reach the workplace by scooter again. In order to simplify the modelling of CO₂eq-emissions, it is assumed that both alternative routes are of equal length (summed kilometres).

When relying solely on a car for commuting, an individual emits 8.3 kg $CO_2eq/workday$ when driving an ICEV, or 3.5 kg $CO_2eq/workday$ when driving a BEV (upper column, Fig. 6). The mixed e-scooter/public transport-mode (green/blue columns in Fig. 6) emits approximately 1.5 kg $CO_2eq/workday$ ($4 \times 2 \times 0.0321$ kg $CO_2eq/$ km $+2 \times 12.9 \times 0.049$ kg $CO_2eq/$ km), providing an 82% reduction in emissions compared to driving an ICEV, or a 57% reduction compared to driving a BEV.

After excluding Sundays and Saturdays, 30 vacation days and 20 days for illness and business trips, a total number of workdays per year is 211. The commuter may



Fig. 6 E-scooter enabling the use of public transport during commuting based on an average German workplace distance. E-scooter applied to reach a bus stop or a metro station in about 2 km of distance from home (green column), followed by a bus/metro trip (blue column), followed by 2 km travelled with the scooter to the workplace (green column). Data based on full life cycle impacts and taken from Fig. 1 (averaged for the Al and plastic e-scooter). Other than in Fig. 1, car occupancy here set to 1 person/car. GWP/ pkm for public transport (bus + train) averaged for conventional bus + train and electric bus (Fig. 1). BEV: battery electric vehicle. ICEV: internal combustion engine vehicle

not prefer to use the scooter on extremely cold and rainy days. According to DWD [70], Germany has experienced a long-term trend with increasing winter temperatures, resulting in only 17 icy days in 2022 geographically averaged (icy days=days with constant temperatures below the freezing point). The decision of whether or not to use the scooter on a (partly) rainy day, which statistically occurs every third day, is subjective. Additionally, the decision may depend on the distance to be travelled. Assuming, in total, for 155 workdays the e-scooter may be a suitable option, while on the remaining 56 days the car would still be preferred. The average commuter owning a combustion engine car, which is still the vast majority, would emit 1.75 t CO₂eq/year based on 100% car use. However, if switching to the mixed scooter/public transport for 155 days and keeping the car for only 56 days, the average commuter would emit only 0.70 t CO₂eq/ year. This results in a 60% reduction in CO_2 eq emissions. On the other hand, a commuter already owning an electric car would emit 0.74 t CO₂eq/year with a 100% car use. However, if this commuter would take the scooter/ public transport on 155 days and use the BEV on 56 days, $0.43 \text{ t CO}_2 \text{eg/year}$ would be emitted only for travelling to work, equivalent to a 42% reduction in emissions.

In Germany, an adult emits an average of $11.2 \text{ t } \text{CO}_2\text{eq}/\text{year}$ for all expenditures [71], number for the year 2016). The modelled e-scooter commuting application can save 2.8% of the average personal annual GHG emissions if the

commuter owns an electric car, and 9.4% if a combustion engine car is used, which is the most probable situation. Savings of this magnitude should not be underestimated: in Germany, the mobility system has failed to deliver the desired climate-relevant emission reductions, with emissions remaining at a high level of 143.9 Mio t CO₂eq/year recently ([72], number for the year 2023). Assuming that half of the 68% of the 16.9 million employees who currently commute to work by car in Germany [24], switch to the e-scooter/public transport application described above, and given that these commuters own combustion engine cars, a saving of 6.0 Mio t CO₂eq/year can be achieved $(0.5 \times 0.68 \times 16.9 \text{ million} \times 0.6 \times 1.75 \text{ t CO}_2 \text{eq})$ year). Accordingly, the use of e-scooters in the described model could result in a significant 4.2% reduction of GHG emissions throughout the German mobility system. Passenger transport alone emits 122.8 Mio t of CO₂eq/ year in Germany ([73], number for 2019). In relation to this, the use of scooters in commuting could save 4.9% of emissions. This modelling does not aim to deliver exact emission saving figures, but rather to indicate the potential magnitude of a GHG emission reduction by e-scooter use.

To achieve lifetime emissions of a low 32 g CO₂eq/pkm (averaged for the Al and the plastic scooter), a mileage of 5400 km is required, as this modelling has revealed. The e-scooter commuting application described above comes with an estimated mileage of 1240 km/year. To reach the 5400 km mileage, the private e-scooter use case described would require 4.4 years of continuous use. The feasibility of achieving this mileage needs to be critically discussed. Fortunately, in private use, there will likely be no losses due to vandalism or inappropriate battery treatment. Additionally, unlike fleet operators, private users receive a 2-year warranty, which can be extended to 3 years (e.g., [74]), or the e-scooter can be leased instead. Based on these circumstances, it seems realistic to make a mileage of 5400 years within 4.4 years possible and attain the suggested CO₂eq savings.

Limitations of this study and further research

Although the LCI for the LCA model was based on measured material data for the aluminium e-scooter and primary data from the producing company for the plastic e-scooter, the final assembly stage is missing for both e-scooter models due to a lack of solid data. It is assumed that the impact of the final assembly stage for both e-scooter models would be similar, making the comparison of the two models still valid. However, when comparing with other studies, it is important to carefully consider the system boundary of those studies. Although the assembly stage was included in Hollingsworth et al. [29] and Severengiz et al. [30], it only accounted for approximately 1% of the total GWP, so it may be negligible. However, it still had a greater proportion than certain components and materials of the corresponding e-scooter in Hollingsworth et al. [29].

In addition, recent technological advancements in autonomous electric kick-scooters for fleet operators also involve the transfer and processing of data through cloud services and artificial intelligence (AI). An example of this is the Segway[®] T60 kick scooter (Segway [75]). This study does not cover data processing and storage. However, for future studies, particularly those involving fleet operations with autonomous e-scooters, it is recommended that the carbon footprint of data processing and storage by artificial intelligence and cloud services should be included in LCI modelling [76–78].

The decarbonizing potential of e-scooters in commuting was modelled based on a static use case to quantify possible savings. A more dynamic model that considers trip length, weather conditions, and other influencing factors would enhance the significance of this potential.

Conclusions and outlook

As there are large fleets of shared e-scooters operating in major cities around the world, scientific LCA modelling has focused on this application, resulting in very inconsistent GWP in CO_2eq/pkm and often no benefit compared to competing mobility modes. This study found that most of the scientific data published to date suffer from high modelling uncertainties, e.g., whether they include recycling and raw material substitution credits, deliberately exclude them or do not model EOL impacts at all. This results in a relatively high bias in the literature data in the range of 26–41%, as shown by the data presented here.

After considering those EOL credits however, e-scooters appear in a slightly better light given a proper recycling strategy is followed at the EOL stage. In principle they can halve the CO₂eq/pkm impact of electric passenger cars and of conventional buses and trains. In addition, autonomous e-scooters could reduce the impact of collection and distribution within fleets. However, this would require a three-wheeled design. Unfortunately, our internet search of the world's leading scooter rental companies (Veo, USA; Bolt, Europe, Africa and South America; Voi, Europe; Lyft, USA; Tier, Europe; Bird, 450 cities worldwide; and Lime, USA) did not reveal a single scooter that deviated from the standard two-wheel design. However, autonomous scooters, such as the Segway[®] T60 kick scooter, have been developed specifically for fleet operators and may be of interest to them in the future to reduce losses due to vandalism and to collection and distribution costs, both economically and environmentally (Segway [75]).

CO₂eq emission benefits depend heavily on the mileage the scooters are driven before they are recycled or disposed of. Fleet operators currently argue for 2 years of use (equivalent to 5,400 km of mileage), and so far, LCA modellers have followed this perception. Given the poor maintenance conditions observed in many e-scooter fleets, the high number of scooters lost to vandalism, and the very low cost to fleet operators of simply replacing old scooters with new ones, there have always been questions about how realistic such lifetime expectations are. Traditional assumptions about the average lifetime of e-scooters in shared fleets were then turned on their head by Reis et al. [39]: in a shared e-scooter fleet in Lisbon, these authors found average lifetime mileages of only between 90 and 225 km.

We therefore refrain from recommending a shared fleet application for e-scooters but focus on a private application where a mileage of 5400 km in 4.4 years of use seems realistically achievable. This mileage can be seen as a minimum that needs to be guaranteed by the right circumstances for e-scooters to be competitive with other modes of transport in terms of environmental performance.

Given the precarious situation in many countries where the mobility system refuses to systematically reduce CO_2 eq emissions, all options must be on the table to bring about change. As modelled here, e-scooters for private commuting, for example, can deliver a 4% reduction in GHG emissions across the German mobility system. Another positive conclusion from this research is that by switching from the traditional aluminium frame material to plastic, a 26% reduction in lifecycle GHG emissions can be achieved. Optimising the type and material of the electric motor promises a further 23% saving [61].

Finally, e-scooters do not emit noise or exhaust when used in urban areas. In addition, they are fun for young people, give them an idea of a new kind of mobility in contrast to car ownership, and can therefore be a stepping stone towards sustainable mobility. However, this may require a redistribution of road space, away from cars and towards more space for pedestrians, bicycles and e-scooters. When it comes to the use of such micro-mobility vehicles in shared fleets, new regulations will need to ensure a much longer average lifetime and appropriate recycling strategies before environmental benefits can be realised. Fleet operators must be forced to systematically monitor vehicles and protect them from destruction and loss. Until legislation addresses this and prevents the current waste of materials, it will be difficult to demonstrate the environmental benefits of shared scooters in commercial fleets.

Ultimately, an autonomous 3-wheeled e-scooter based on climate-friendly materials, such as the Floatility vehicle modelled here, can have the most positive life cycle impact and also increase the social acceptance of this mode of transport: It is safer to ride and it would not block pedestrian walkways, because it can move away by itself.

Abbreviations

Al	Aluminium
APOS	Allocation at point of substitution
BASF	Badische Anilin- & Sodafabrik
BEV	Battery electric vehicle
CH	Switzerland
ĊN	China
CO.ea	Carbon Dioxide equivalents
CO ₂ CQ	Carbon Dioxide equivalents
	Disability adjusted Life Vears
DALI	Disability-aujusteu Life fears
DCB	Dichlorobenzene
t	Euro
EOL	End-of-life
e-scooter	Electric scooter
FU	Functional unit
g	Gram
GHG	Greenhouse gas
GLO	Global
GWP	Global warming potential
Н	Hierarchist
HD	High density
HT	Human toxicity
ICEV	Internal combustion engine vehicle
	International Reference Life Cycle Data System
IDCC	International Danal on Climate Change
IFCC	International Parlel On Climate Change
150	International Organization for Standardization
кg	Kilogram
km	Kilometre
km/h	Kilometre per hour
kW	Kilowatt
kWh	Kilowatt-hour
lb	Pound
LCA	Life Cycle Assessment
LCI	Life Cycle Inventory
М	Month
М	Metre
Mio	Million
my	Metre and year as functional unit for roads in econyent
iny	processes
NMVOCog	Non mothane velatile organic compounds equivalents
No	Numere: number
INO.	Numero; number
NO _x	Nitrogen oxides
P	Piece as a functional unit for products in econvent processes
PA6	Polyamid 6
PC	Polycarbonate
PE	Polyethylene
Pkm	Passenger kilometre
PM2.5eq	Fine Particulate matter (2.5 μm) equivalent
ReCiPe	Method for LCI assessment developed by three Dutch scientific
	institutions
RER	Europe (scope)
RoW	Rest of World (scope)
SAF	Society of Automotive Engineers
SOrea	Sulfur Dioxide equivalent
T	Ton
1	Unit
	United States of America
USA	United States OF AMERICA
USD	United States Dollar
yr or y	Year

Supplementary Information

The online version contains supplementary material available at https://doi. org/10.1186/s12302-024-00920-x.

Additional file 1. The Additional file contains the life cycle inventories (LCI) for the plastic e-scooter (**Tables S1–S5**) and the aluminium e-scooter (**Tables S6–S9**) of the related study. Tables include all life cycle phases (production, use phase and end-of-life) and the LCI of modelled and modified processes. For the classification of data quality see **Table S10**.

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Author contributions

C.B. and E.H. conceived the original idea, performed the project and collected the data. E.H. and C.B. wrote the main manuscript and E.H. prepared the figures. C.B and E.H. revised the manuscript and approved the final manuscript.

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Availability of data and materials

The original data are published in Additional file 1: Tables S1–S8.

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Competing interests

The authors declare that they have no competing interests.

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