



# Environmental implications of shared micromobility services

Dr. Daniel J. Reck | 8 September 2022

### Several new mobility services were recently introduced to cities



https://www.voanews.com/economy-business/e-scooters-put-swedish-startup-road-positive-cashflow



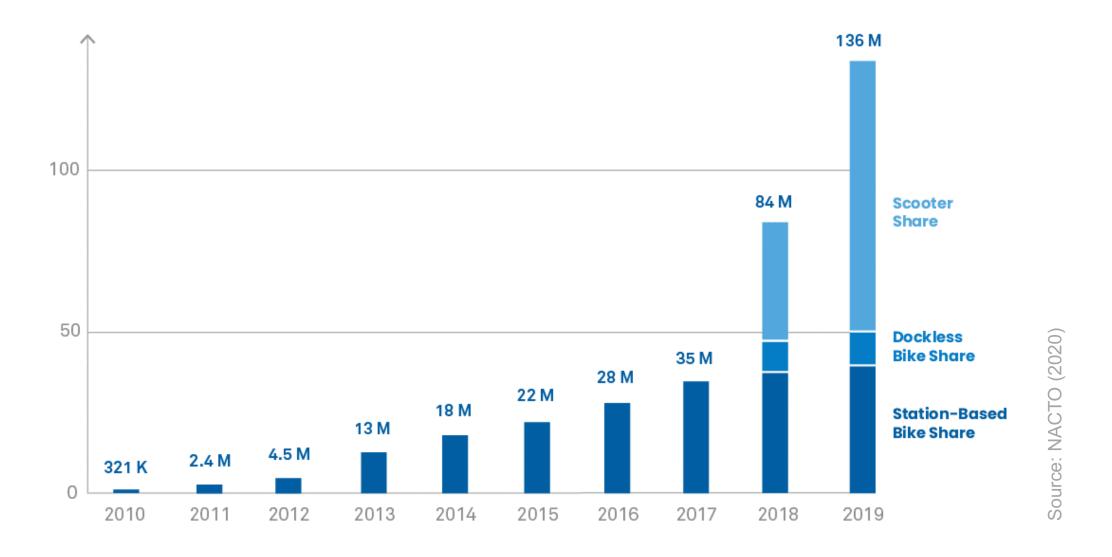
https://seattletransitblog.com/2020/05/14/with-ubers-investment-lime-is-getting-back-into-the-local-bike-share-game/



https://www.aa.com.tr/en/americas/us-envoy-concerned-by-ubers-departure-from-colombia/1725652



#### Dockless shared micro-mobility services have seen particularly fast roll-outs







### ... and have challenged city administrations in many places



https://www.forbes.com/sites/alexledsom/2019/09/10/e-scooter-havoc-across-french-cities-is-acrackdown-needed/?sh=3d244de83038

#### The Atlantic

#### The Bike-Share Oversupply in China: Huge Piles of Abandoned and Broken Bicycles

ALAN TAYLOR | MARCH 22, 2018 | 30 PHOTOS | IN FOCUS

https://www.theatlantic.com/photo/2018/03/bike-share-oversupply-in-china-huge-piles-of-abandoned-and-broken-bicycles/556268/





### Effective planning and regulation is hindered by knowledge gaps

#### **Use of shared micro-mobility**

- How does the use of different shared micro-mobility services differ across space and time?
- How do users choose between different shared micro-mobility services?

#### Users of shared micro-mobility Interactions with other modes

- How do user groups differ between shared micro-mobility services?
- Are there any equity concerns?

- How do shared micro-mobility services affect the use of other transport modes?
- Which do they substitute?
- What are their environmental implications?

#### Data and methods

How can emerging data sources be used to advance our understanding of shared micro-mobility travel behavior?

Adapted from: Transportation Research Part D: Transport Environment - Call for Papers for Special Issue: Understanding and planning shared micro-mobility (15 Feb 2020)





#### Overview of contributions on shared micro-mobility

All papers available open access online

#### **Use of shared micro-mobility**

#### Users of shared micro-mobility Interactions with other modes







Reck, D.J., H. Haitao, S. Guidon and K.W. Axhausen (2021) Explaining shared micro-mobility usage, competition and mode choice by modelling empirical data from Zurich, Switzerland, *Transportation Research Part C: Emerging Technologies*, **124**: 102947.

Reck, D.J. and K.W. Axhausen (2021) Who uses shared micro-mobility services? Empirical evidence from Zurich, Switzerland, *Transportation* Research Part D: Transport and Environment, **94**: 102803.

Reck, D.J., H. Martin and K.W. Axhausen (2022) Mode choice, substitution patterns and environmental impacts of shared and personal micro-mobility, *Transportation Research Part D: Transport and Environment*, **102**: 103134.

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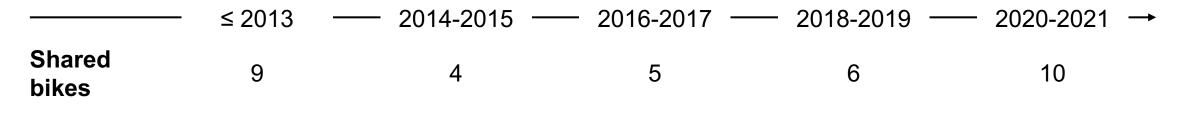


# Environmental impacts of shared micro-mobility services





#### (Peer-reviewed) literature on shared micro-mobility



e.g., Fishman et al., 2013; Fishman, 2016; Ricci, 2015; Teixeira et al., 2021

# Shared e-bikes

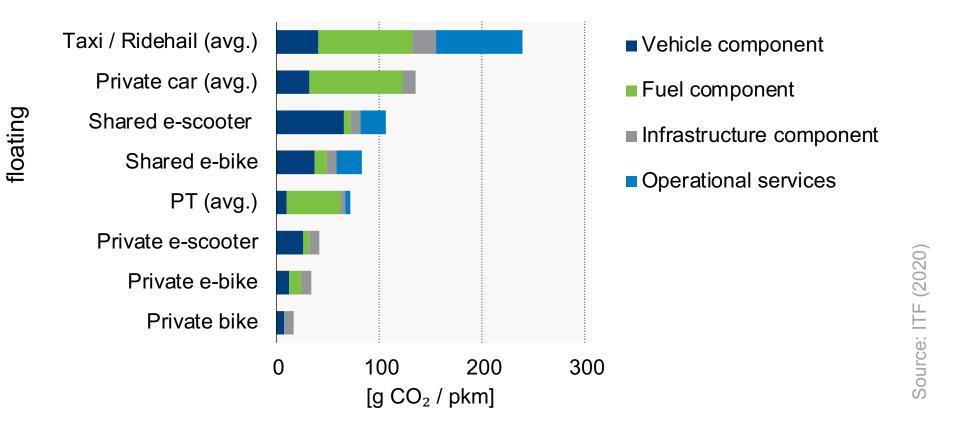
e.g., Campbell et al., 2016; Guidon et al., 2019; He et al., 2019

# Shared 4 16 e-scooters

e.g., Caspi et al., 2020; Noland, 2021; Wang et al., 2021

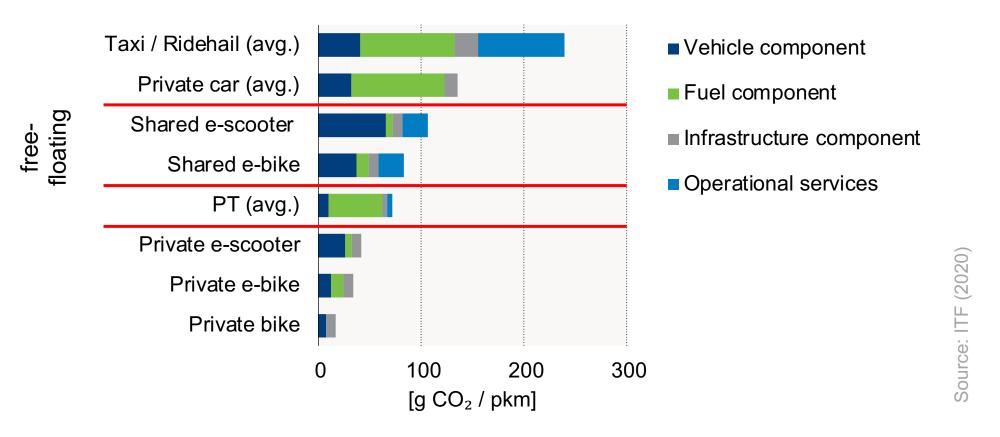


• ITF (2020), de Bortoli and Christoforou (2020), Hollingsworth et al. (2019)



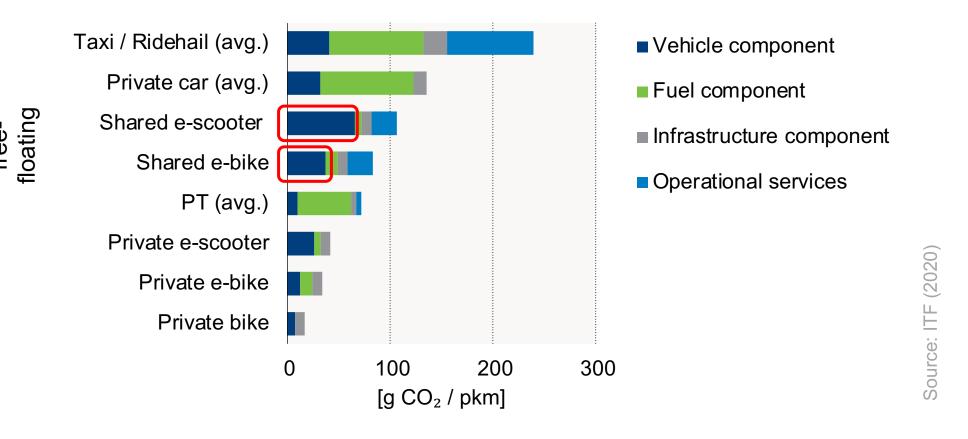


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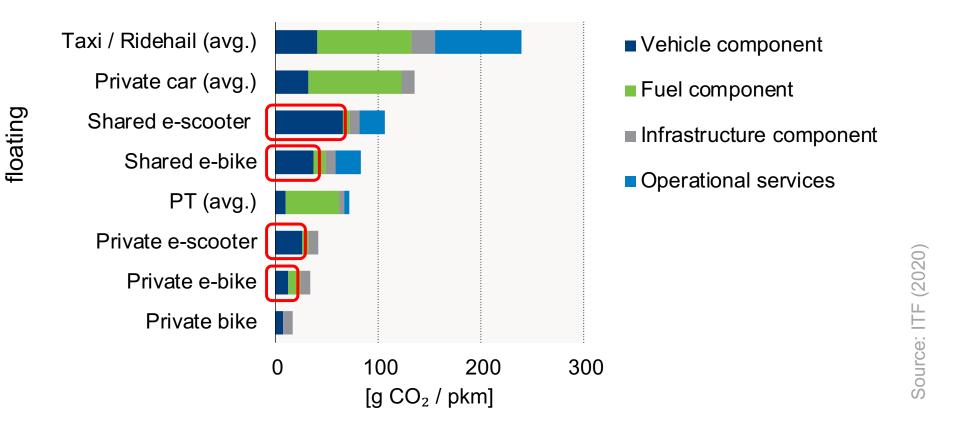


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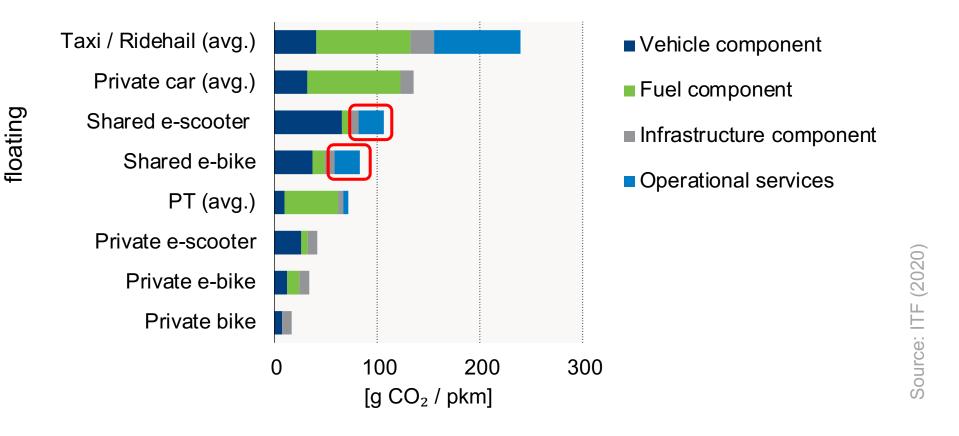
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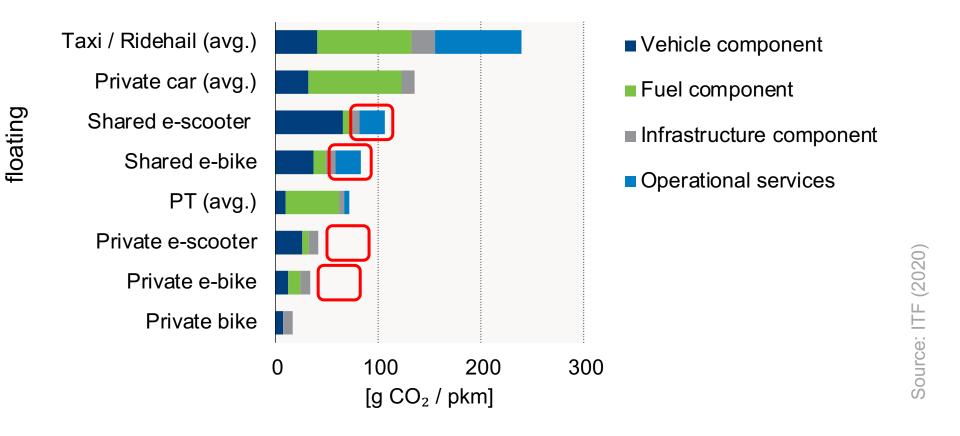


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#### Life cycle assessments: summary

ITF (2020), de Bortoli and Christoforou (2020), Hollingsworth et al. (2019)

- 1. Shared micro-mobility services are more sustainable (in terms of CO2 / pkm) than private cars
- 2. Shared micro-mobility services are **less sustainable** (...) than public transport
- 3. Shared micro-mobility services are less sustainable (...) than private micro-mobility vehicles





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However, life cycle assessments only provide part of the answer.





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  - A. Shared e-scooter
    - replaces trips otherwise walked (40%)
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    - induces 10% new trips





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- CO<sub>2</sub> emissions
  - A. Shared e-scooter (106 g CO<sub>2</sub> / pkm)
    - 40% \* 0 g CO<sub>2</sub> / pkm
    - 60% \* 72 g CO<sub>2</sub> / pkm
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- B. Shared e-scooter (106 g CO<sub>2</sub> / pkm)
  - 20% \* 239 g CO<sub>2</sub> / pkm
  - 30% \* 135 g CO<sub>2</sub> / pkm
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  - 10% \* 0 g CO<sub>2</sub> / pkm
- We need substitution patterns to evaluate how sustainable a new transport mode is.
- Which substitution patterns do we observe in reality?



# Two approaches to elicit substitution rates and derive net CO<sub>2</sub> emissions

#### Survey-based approach (well established)

- Did you conduct a trip with an [e-scooter, e-bike, ...] in the past 7 days?
- If yes, would you have made this trip if this vehicle had not been available?
- If yes, which alternative transport mode would you have chosen?

#### Choice model based approach (new)

- Estimate mode choice model
- Set availabilities of mode of interest to 0
- Estimate alternative choices



# Two approaches to elicit substitution rates and derive net CO<sub>2</sub> emissions

#### Survey-based approach (well established)

- + Easy & cheap to conduct (1 survey is enough)
- Survey responses often biased (recall bias, social desirability bias)
- Responses valid only for last trip
- Metric: trips. But replaced distance is more important to calculate environmental impact

#### Choice model based approach (new)

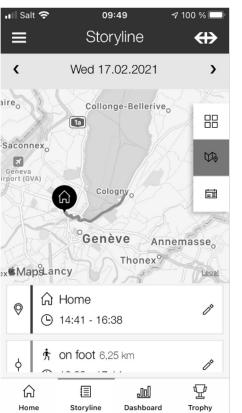
- Difficult & expensive to conduct (GPS tracks + booking data)
- + No behavioral biases (revealed preferences)
- + Responses valid for all trips as they are based on preferences
- + Different metrics possible, incl. precise replaced distances





### Study design

- Study design
  - 06/2020: 1st survey
  - 07-09/2020: 3 months GPS smartphone tracking
  - 10/2020: 2nd survey
- Recruitment
  - 10 000 invitations sent by cantonal statistical office
  - 90 CHF incentive
  - 540 participants completed entire study
  - 65 716 observed trips
- Additional data sources
  - Booking data
  - Vehicle availability
  - Weather data





#### Substitution rates

Substituted mode	Substitution rates (km-level) by micro-mobility mode				
	E-Bike (personal)	E-Bike (shared)	E-Scooter (personal)	E-Scooter (shared)	
Walk	9%	9%	19%	25%	
PT	29%	43%	27%	38%	
Car	48%	15%	25%	15%	
Bike	14%	29%	27%	13%	
E-Bike (personal)		5%	1%	2%	
E-Bike (shared)	0%		0%	5%	
E-Scooter (personal)	1%	0%		1%	
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Substituted mode	Gross emissions	Substitution rates (km-level) by micro-mobility mode			
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	[g CO <sub>2</sub> / pkm]	(personal)	(shared)	(personal)	(shared)
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PT (avg.)	72 <sup>†</sup>	29%	43%	27%	38%
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Net emissions [g CO <sub>2</sub> / pkm]		-54	25	-16	51

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#### Conclusions and implications

- Dockless shared e-bikes and e-scooters emit more CO<sub>2</sub> than the transport modes they replace
  - > Shorter lifetime & production emissions
  - Operations
  - Substitution patterns
- Immediate implications
  - 'Sharing is caring' for the environment
  - ➤ Work with operators to decrease CO₂ emissions (e.g., durability, integration, incentives, availability)
  - ➤ Improve bike infrastructure
- Personal e-bikes and e-scooters emit less CO<sub>2</sub> than the transport modes they replace



# Thank you for your attention.

Questions?

