



## Work Package 5: Analysis

Presentation of project datalogging,  
processing and analysis



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# Project data – data used – up to 2023/07

Data provider	City	Country	Analysis time (days)	Data access	Data start	Analysis period
E-Trucks	Arnhem	NL	33	Yes	2022/06/21	2023/08/01
E-Trucks	Herten	DE	80	Yes	2022/09/12	2023/08/01
E-Trucks	Groningen	NL	-	No	-	-
Enginius	Duisburg	DE	108	Yes	2021/04/23	2023/08/01
Enginius	Brussels	BE	-	No	2023/11/01	-
Enginius	Indre-et-Loire	FR	-	Yes	2023/08/01	-
Holthausen	Aberdeen	UK	-	No	-	-

# Project data

- E-Trucks
  - Daily aggregated values
  - Vehicle data such as speed and distance
  - H2 use and fuel cell energy
- FAUN/Enginius
  - High frequency vehicle sensor values
  - Vehicle data such as axle loads, compactor activation, and distance
  - Driveline data such as motor speed, torque and temperature
  - Powertrain data such as H2 level, battery SOC, fuel cell current and voltage

# Social impact

## Research of drivers' opinions and experiences

- Questionnaire
- Few results (5 replies)
  - ca. 75% Support for Reduce the emissions of the fleet
  - ca. 75% wants to contribute to reduce emissions
  - 100% enjoys driving
  - 100% feel control over the truck
  - ca. 50% is often concerned about the driving range



# Arnhem, Netherlands

Data was used from the time period 2022/07/20 to 2023/06/30

## Distance

58.04km

- Average daily

1857km

- Total

## Speed

36.93  
km/h

- Average overall

## H2 Use

6.15kg

- Average daily

196.92kg

- Total

## H2 Consumption

11.82 kg/  
100km

- Average overall

## H2 Refuel

6 kg

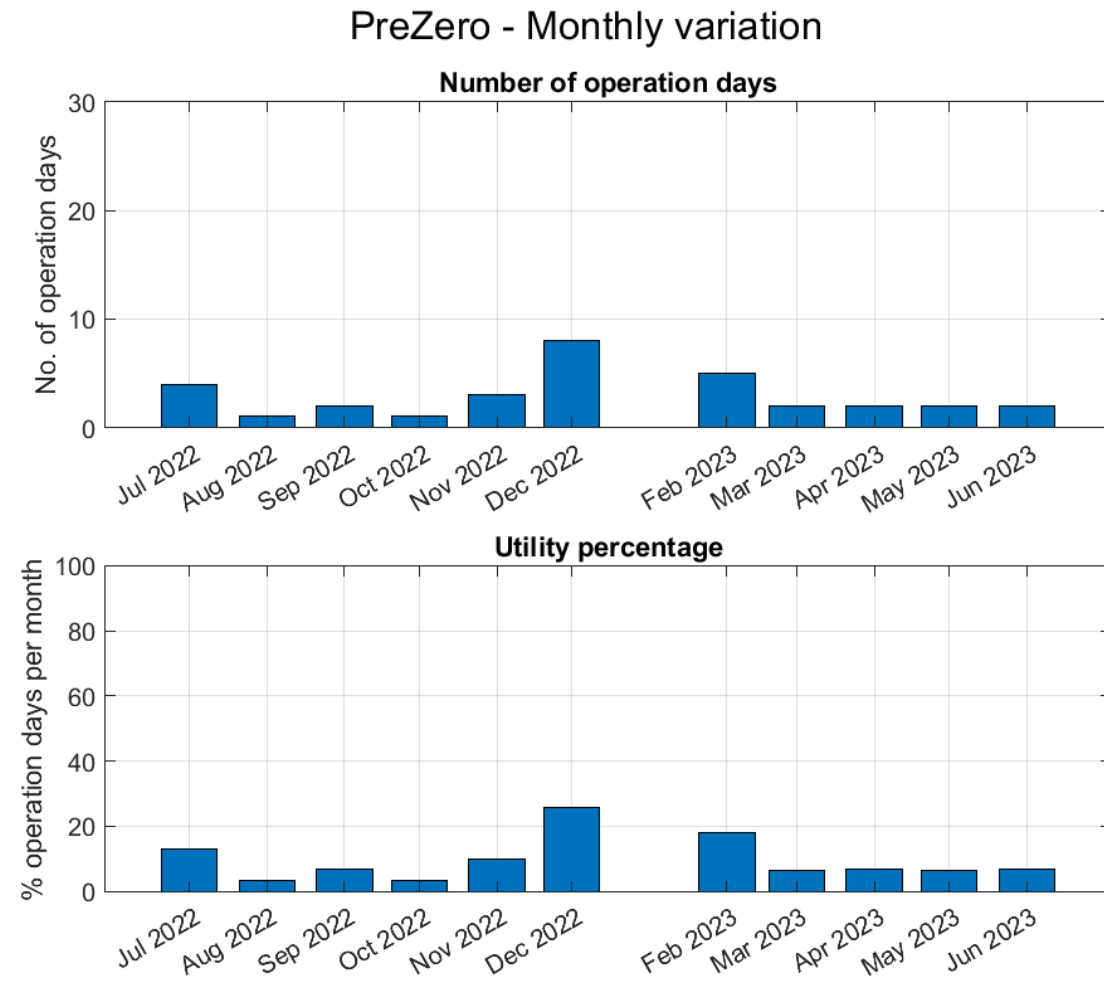
- Average per refuel

54 kg

- Total

# Arnhem Netherlands— Operability

- Fairly limited operation
- except for a couple of months (Jul 2022, Dec 2022, Feb 2023) operation days are less than 4

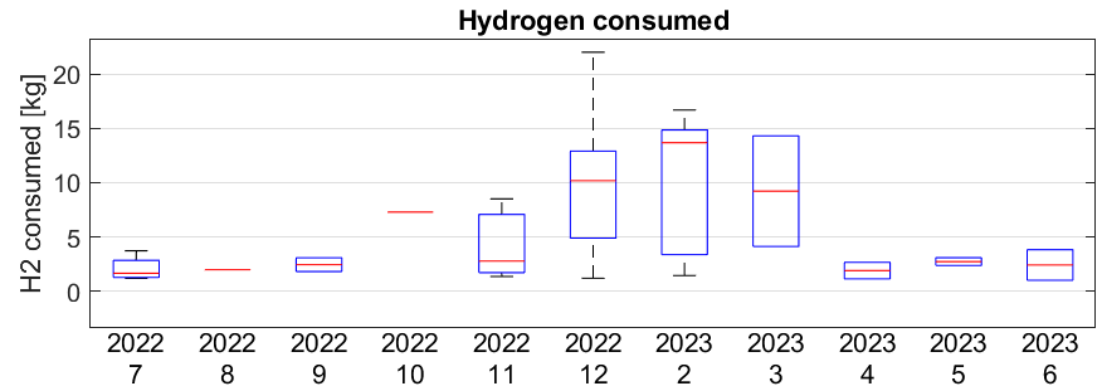
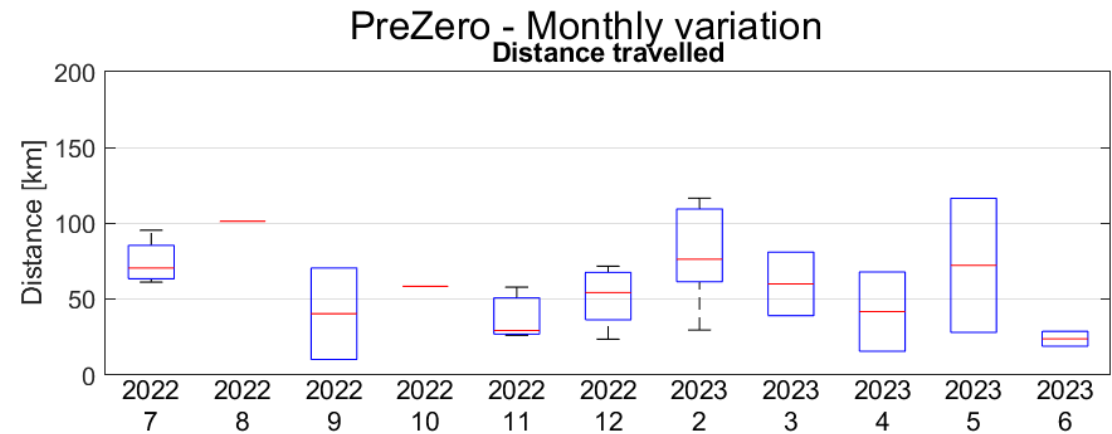


# Arnhem, Netherlands

## – Driving data

Vehicle distance travelled and hydrogen consumed

No refuse weight information on dashboards





# Herten, Germany – Summary statistics

Data was used from the time period 2022/09/12 to 2023/08/01

## Distance

81.73 km

- Average daily

8010 km

- Total

## Speed

28.68  
km/h

- Average daily

## H2 Use

11.22kg

- Average daily

1099.62kg

- Total

## H2 Consumption

13.62 kg/  
100km

- Average daily

## H2 Refuel

12.22 kg

- Average per Refuel

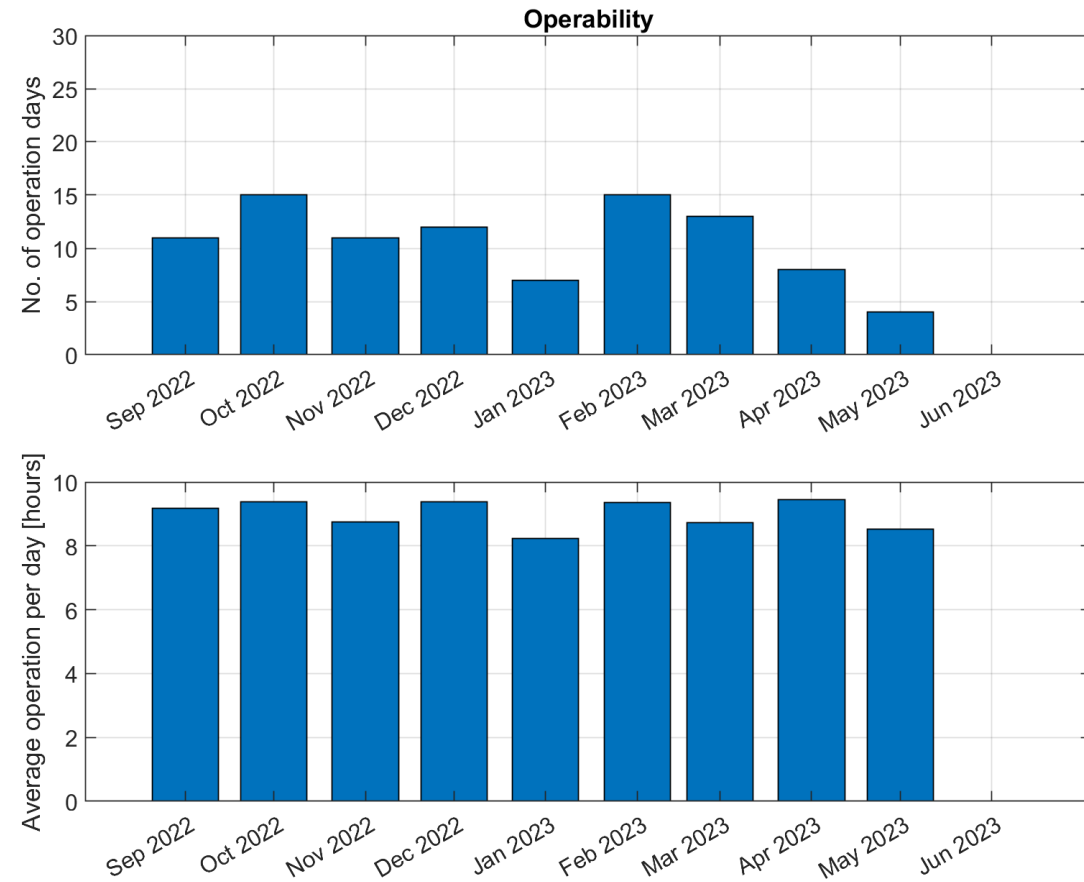
671.84 kg

- Total

# Operability comparison – Herten and Arnhem

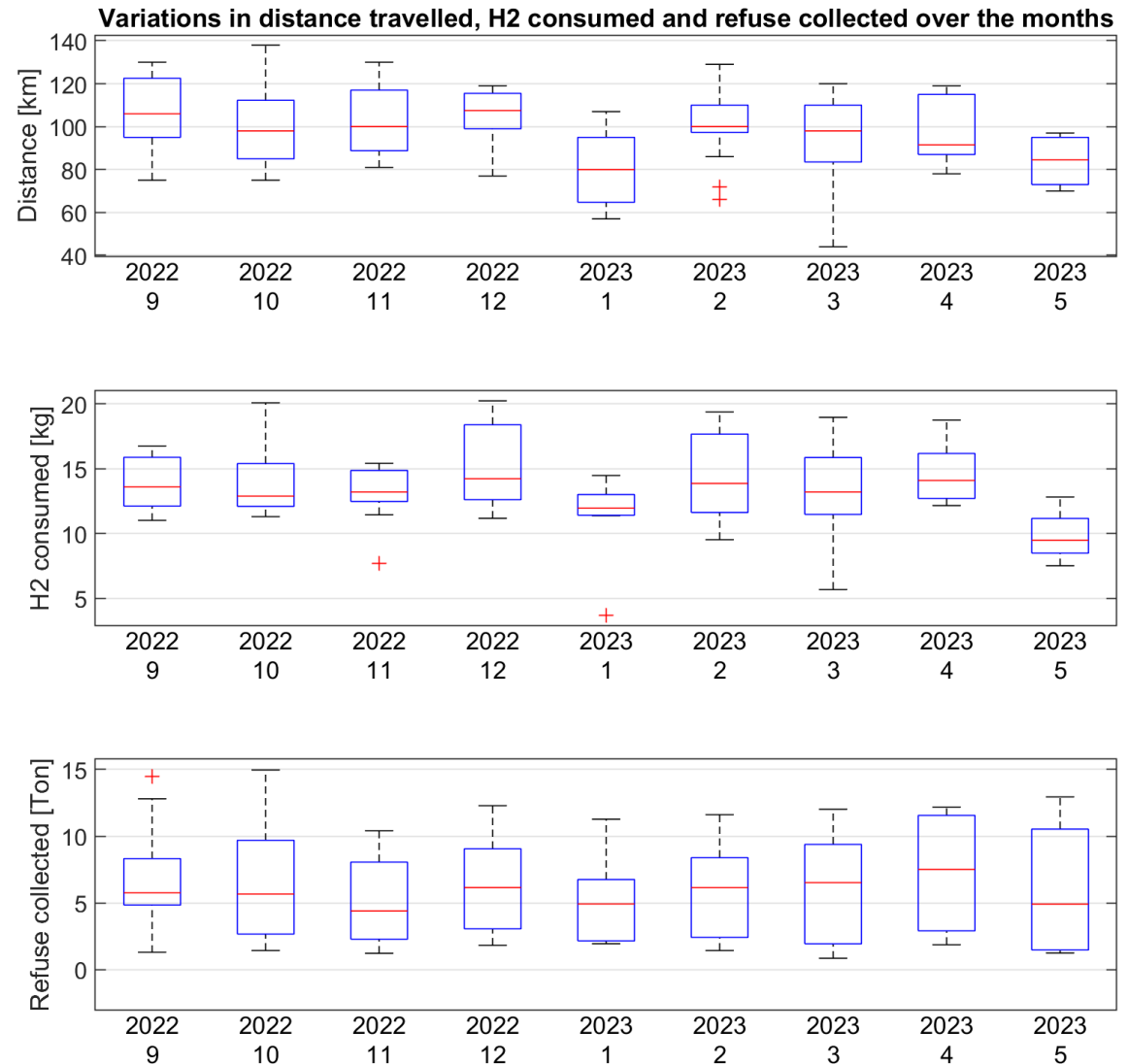
- In general, the RCV remains operational only upto 50% during the observed months
- Maximum no. of operation days (15) are observed in October 2022 and February 2023
- No operation days are recorded in June 2023

On the operation days, RCV performs more than 8 hours of operation on average



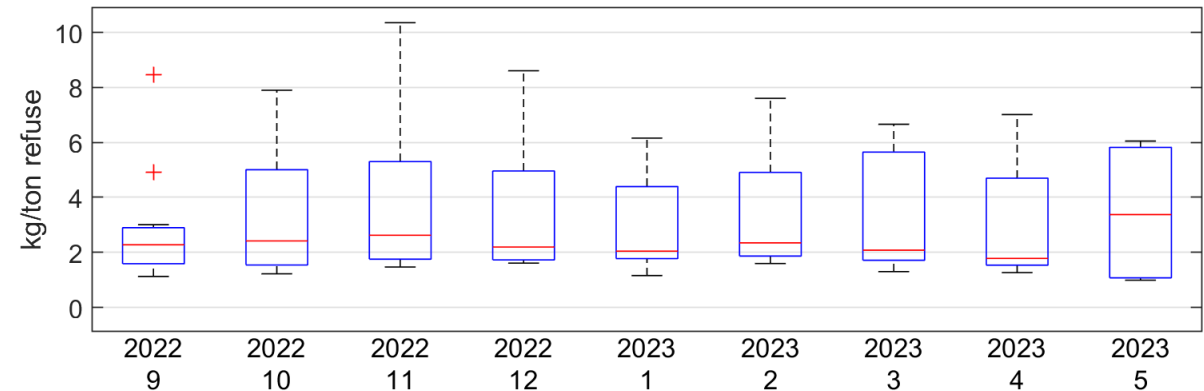
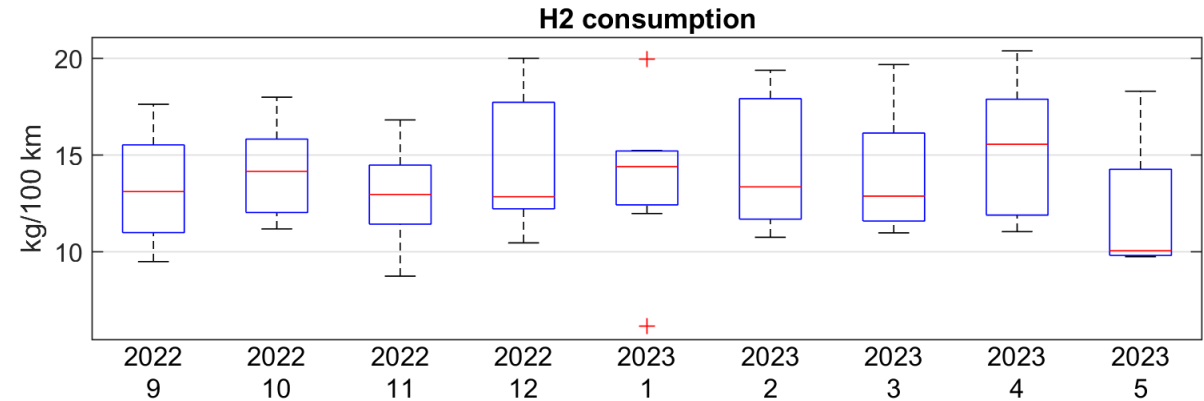
# Herten, Germany – Driving data

- Average distance traveled by the RCV remains close to 100 km, except for January and May 2023 (around 80 km)
  - Least no. of operation days in the two months
- Average H2 consumption remains close to 14 kg, except for May 2023 (around 10 kg)
- Average refuse collected remains close to 5 tons; steadily increasing in the beginning of 2023;



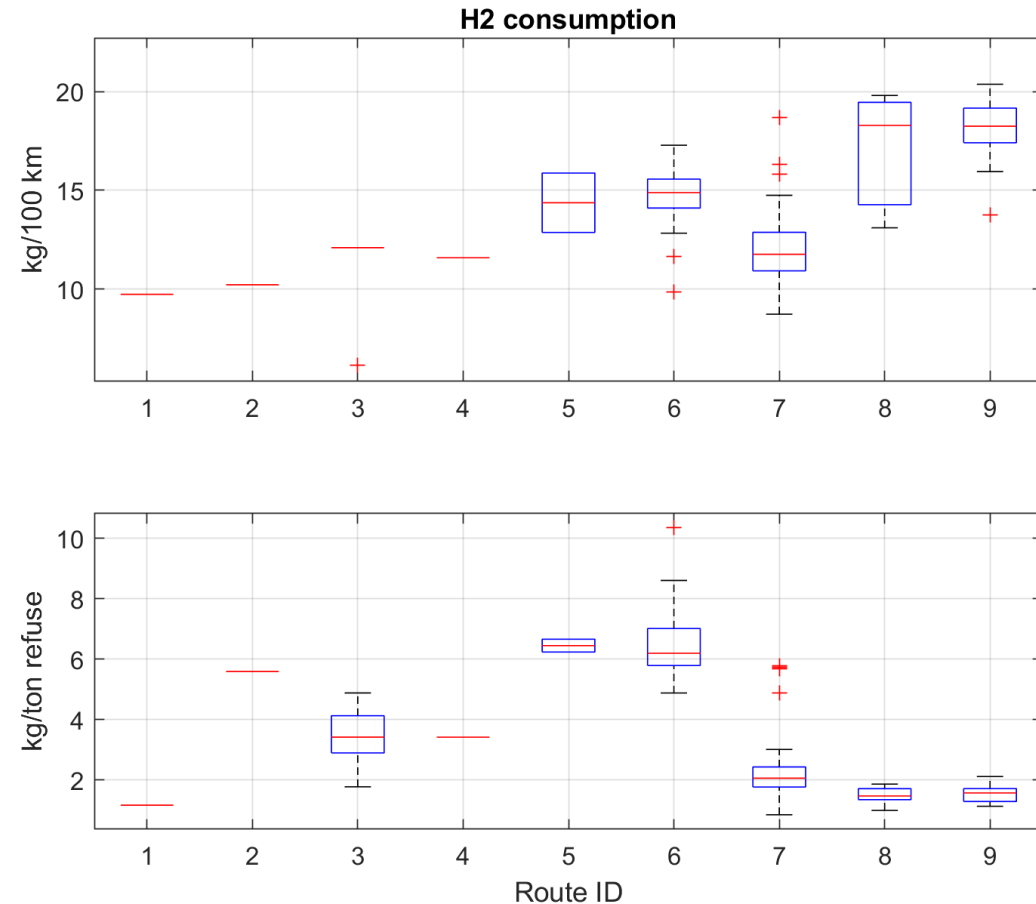
# Herten, Germany – Driving data

- Average H2 consumption per 100 km, varies between around 13 and 15 kg, except for May 2023, viz.
  - Having the less average traveled distance and H2 consumed per day
- Average H2 consumption per ton of refuse collection remains close to 2 kg, except for May 2023 (around 3,5 kg)



# Herten, Germany – Driving data

- Routes 3 and 6 are both low-density refuse collection routes, with comparable densities, and average refuse amount.
  - Route 6 is comparatively longer than 3 and consumed more H2 thus higher consumption for Route 6 compared to 3
- Routes 1, 7, 8, and 9 are associated with high-density refuse, thus their consumption per ton of refuse is smaller than the other routes



# Duisburg, Germany

Data was used from the time period 2022/08/01 to 2023/08/01

## Distance

47km

- Average daily

21km

- Total

## Speed

34 km/h

- Average overall

## H2 Use

3kg

- Average daily

1kg

- Total

## H2 Consumption

4 kg/  
100km

- Average overall

## H2 Refuel

7 kg

- Average per refuel

185 kg

- Total

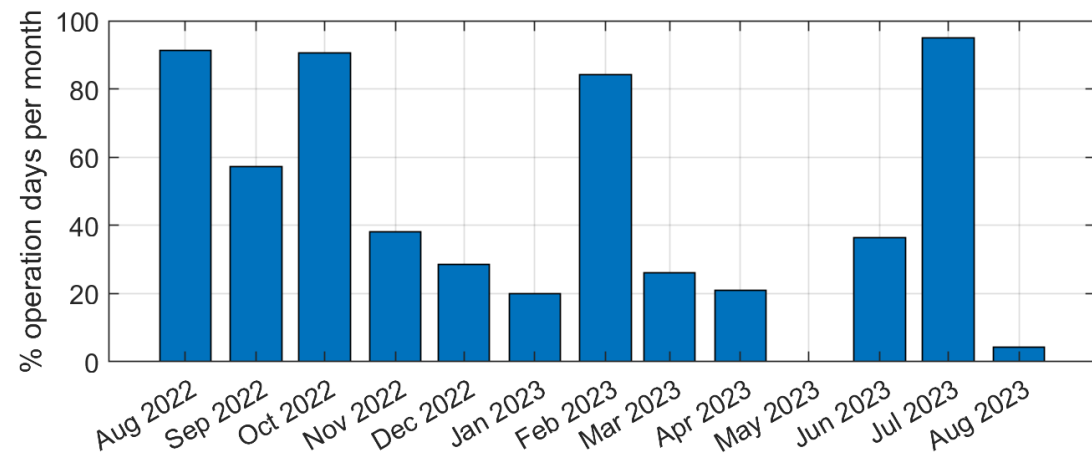
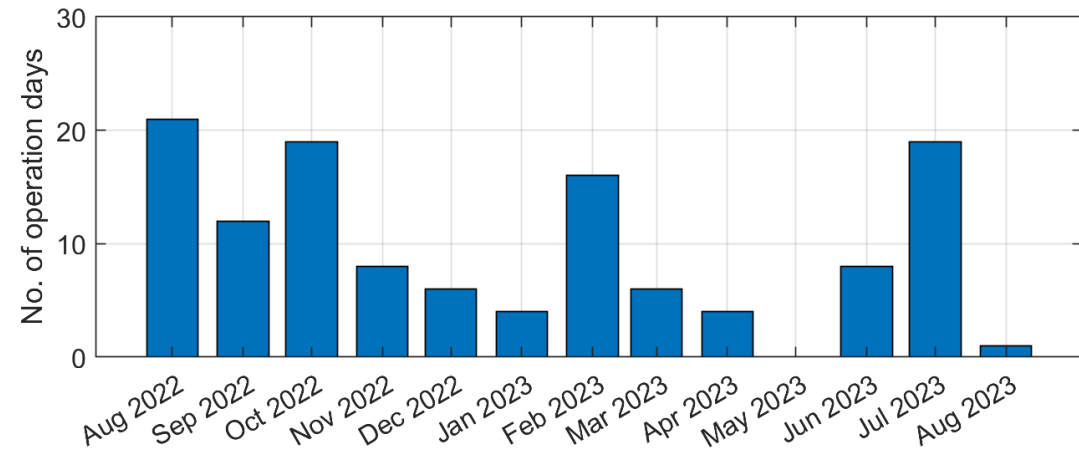
# Duisburg, Germany – Utility

Analysis period: 2022/08/01 to 2023/08/01

- No operation in May 2023

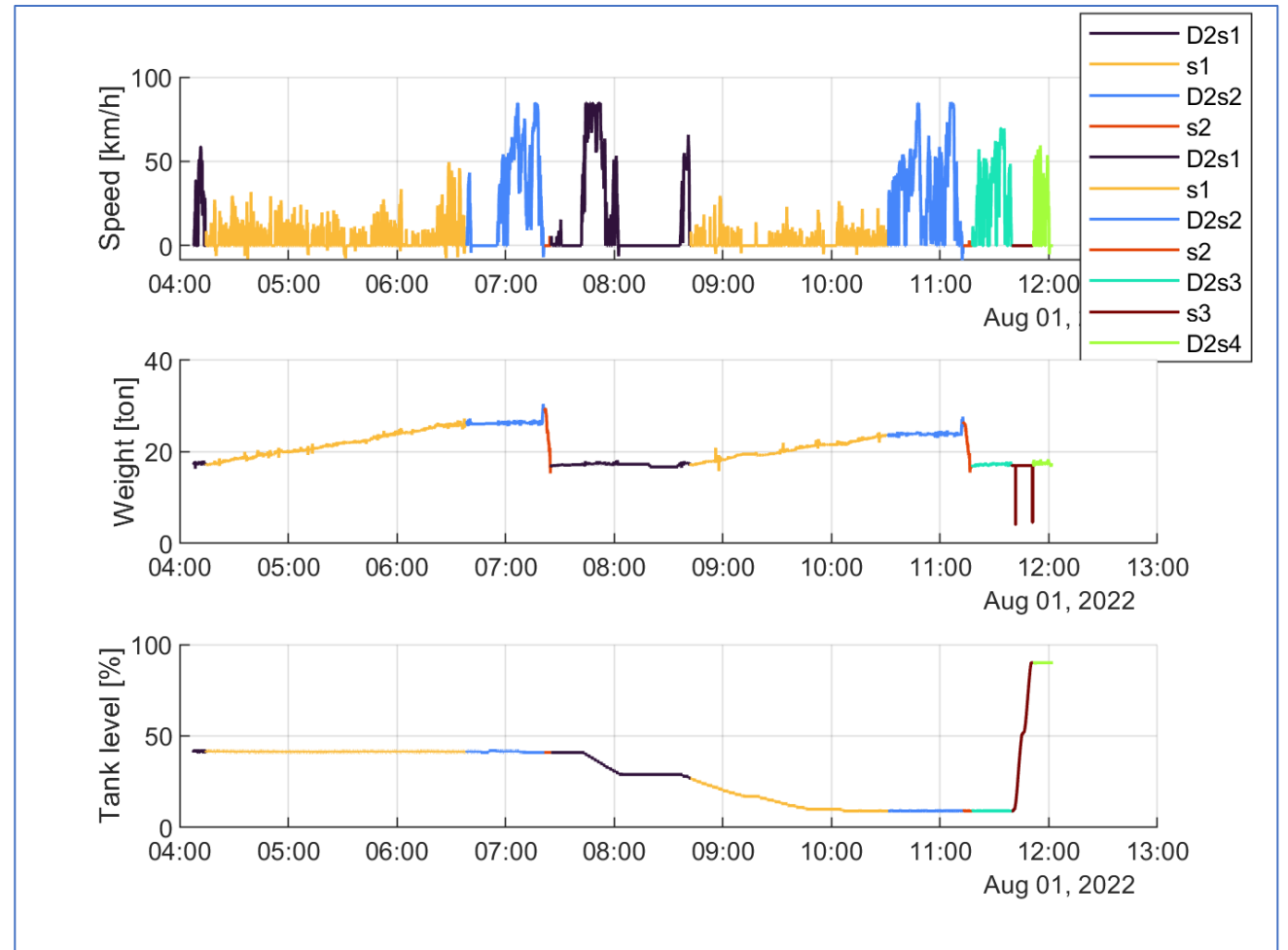
- Bottom figure shows the utility percentage per month excl. weekends

- 4 months above 80%
- 5 months above 50%



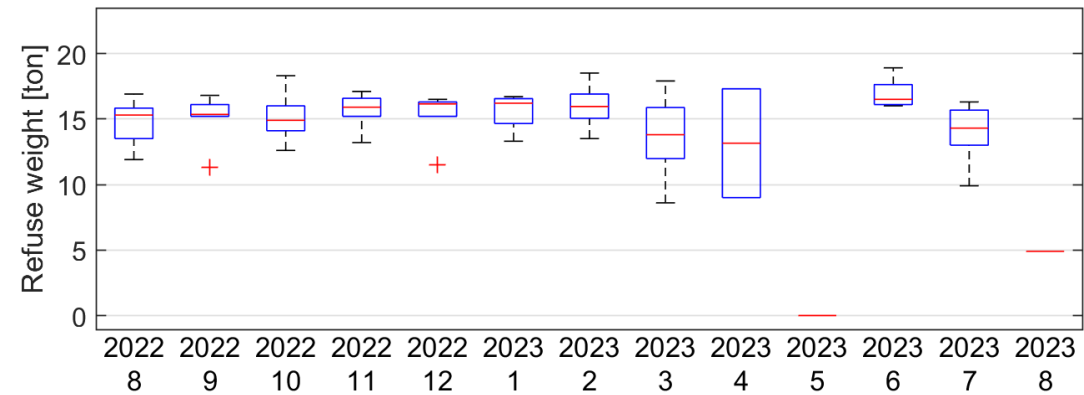
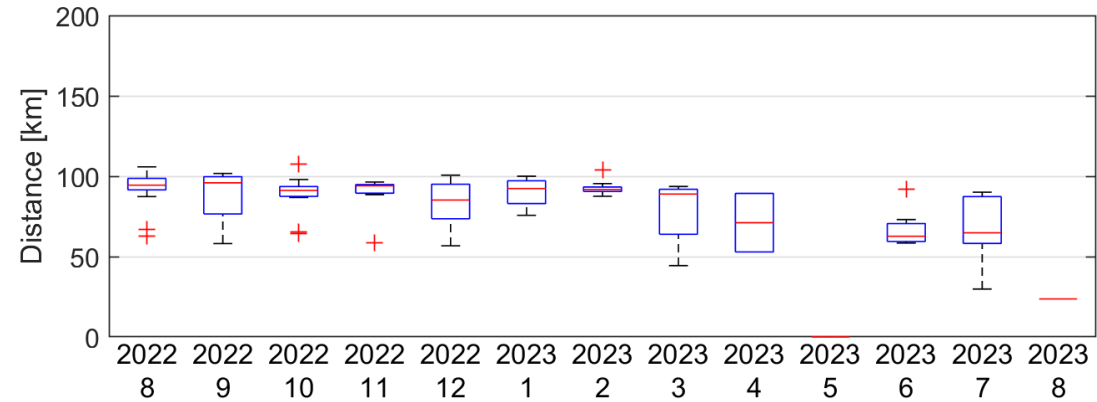
# Duisburg, Germany

- Partial dataset used as input to analysis:  
2022/08/01 to 2023/06/30
- Selecting a single day for analysis:  
2022/08/01
- D2s# - Driving to segment
- s1 – Refuse collection
- s2 – Refuse disposal
- s3 – Refuelling
- D2s4 – Driving to depot

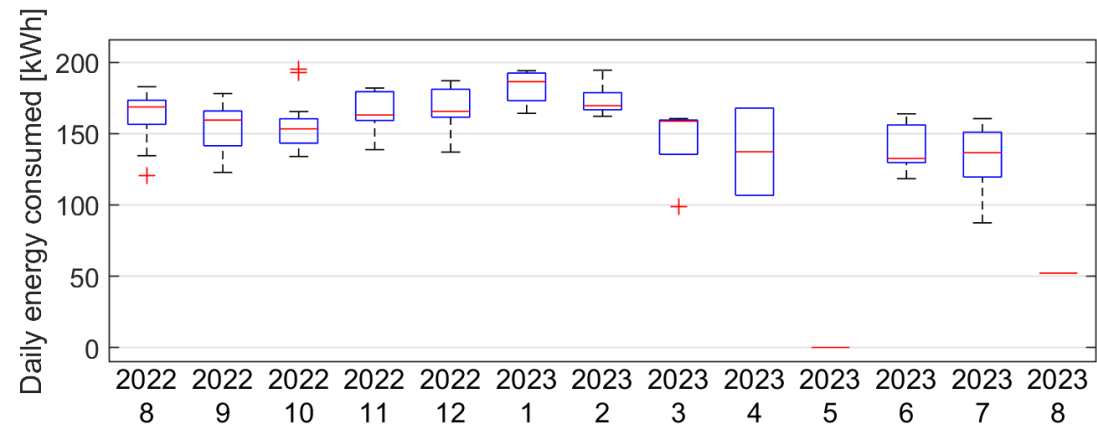
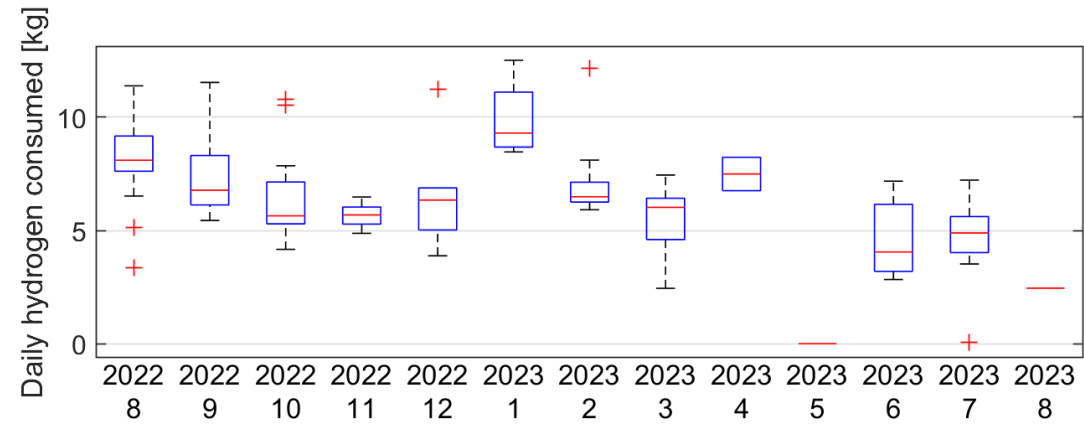




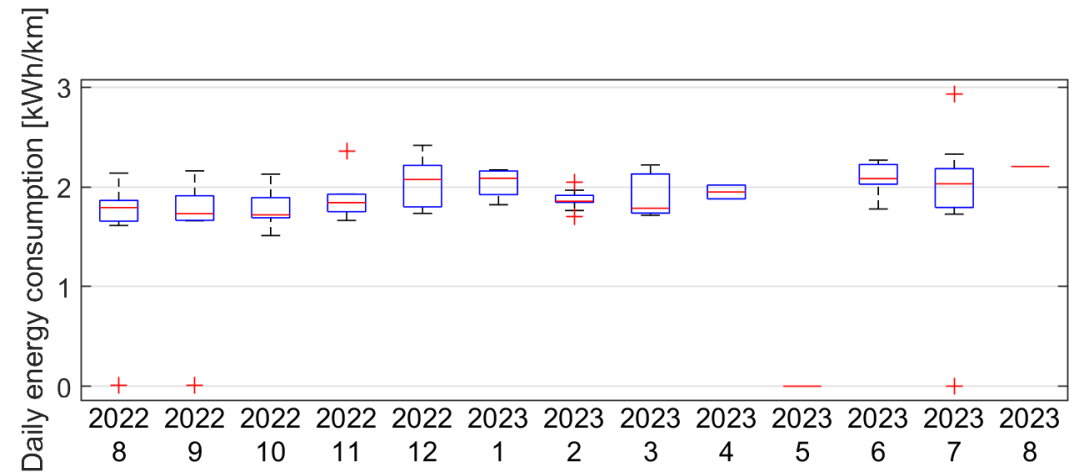
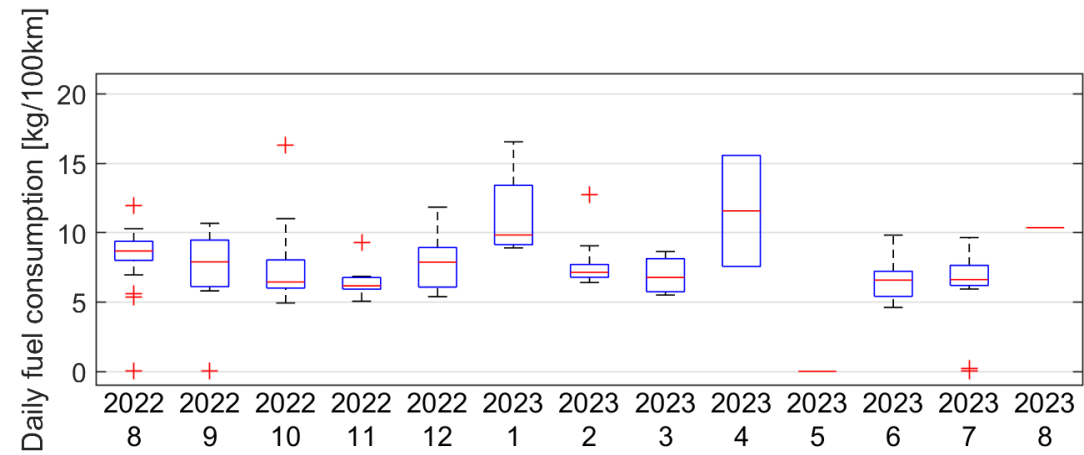
# Duisburg, Germany – Operation



# Duisburg, Germany – Operation



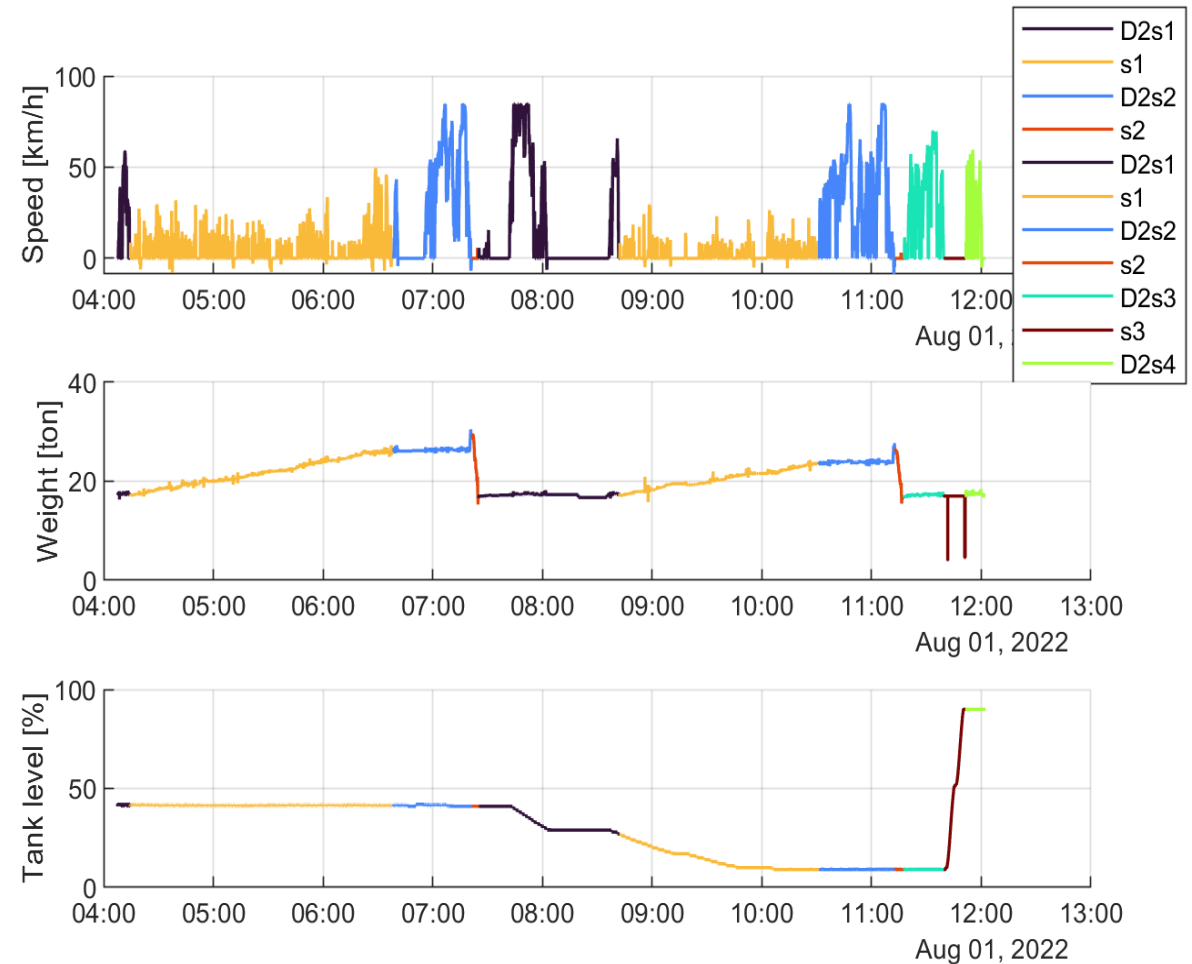
# Duisburg, Germany – Operation



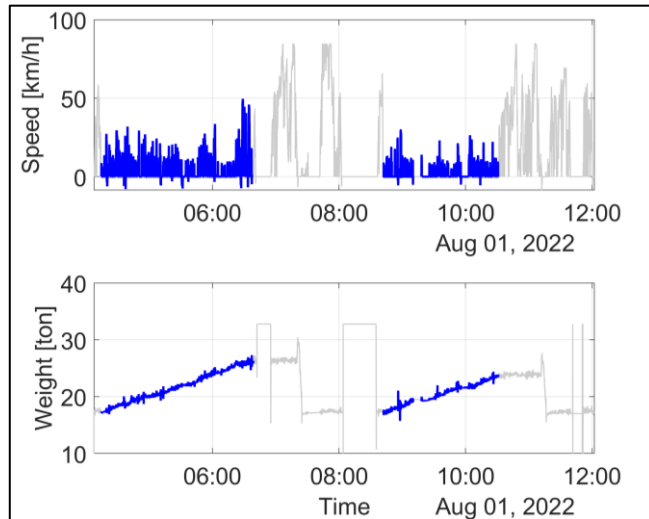
# Duisburg, Germany – Operation segmentation

Example day: 2022/08/01

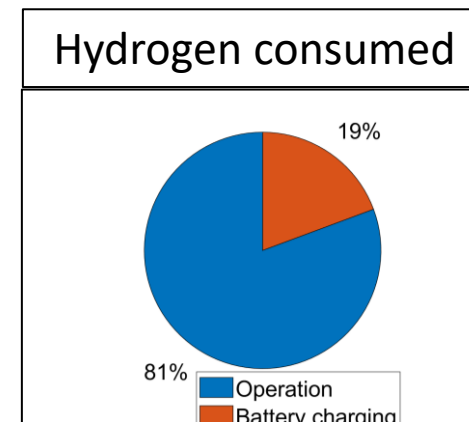
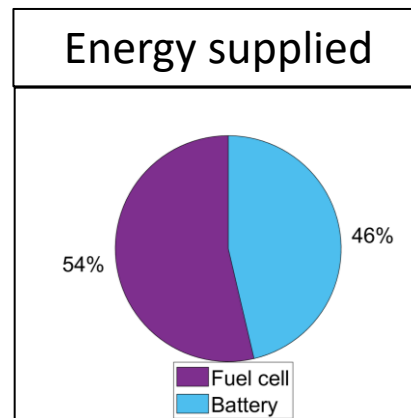
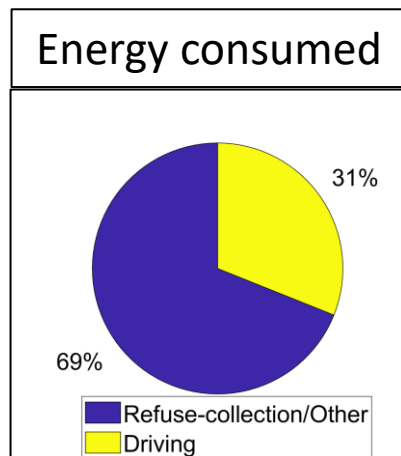
- s1 – Refuse collection
- s2 – Refuse disposal
- s3 – Refuelling
- D2s1 - Drive to refuse collection
- D2s2 – Drive to refuse disposal
- D2s3 – Drive to refueling
- D2s4 – Drive to base location/depot



# Duisburg, Germany – Refuse collection (s1)



No. of collections, [-]	261
Average speed, [km/h]	2,14
Time duration, [h]	4,09
Collected refuse weight, [ton]	15,40
Collection distance [km]	11,11
Energy consumed [kWh]	70,6
Hydrogen consumed [kg]	2,73

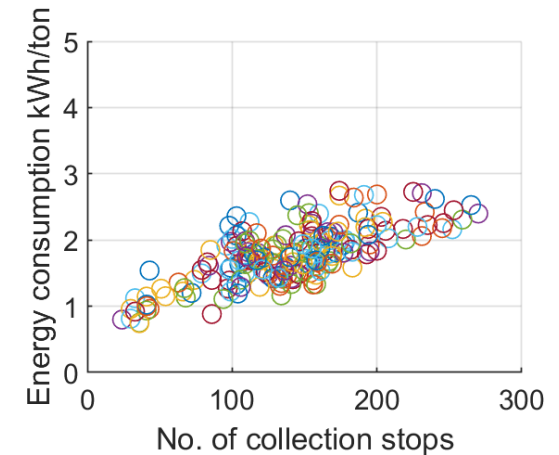
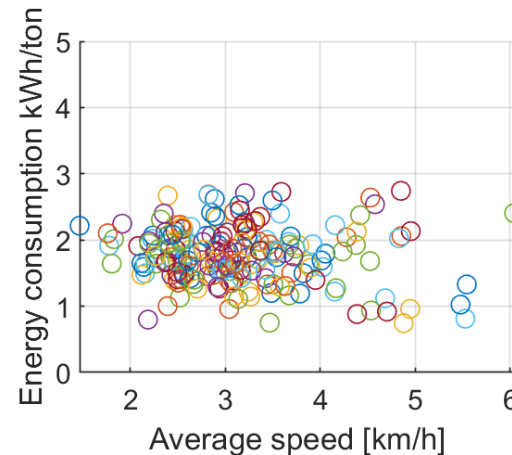
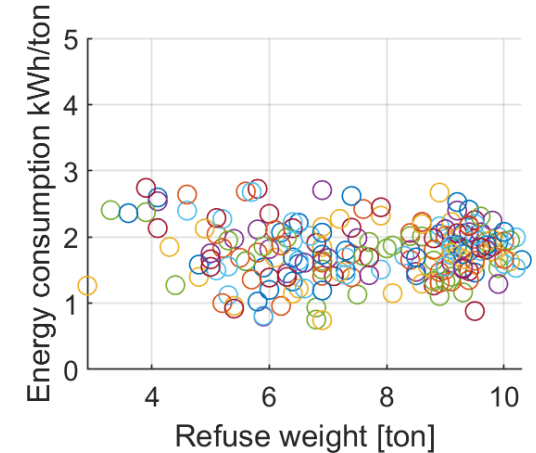
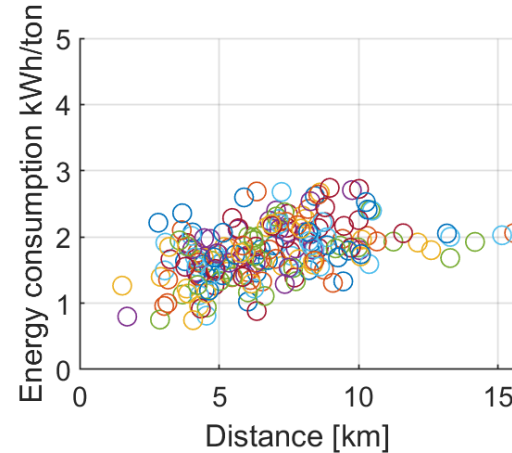


# Duisburg, Germany – Operation: Refuse collection (s1)

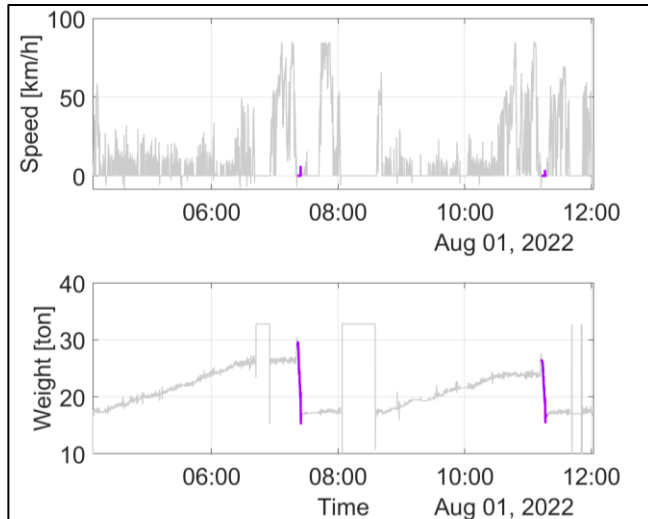
Energy consumption related to driving  
discussed in Drive2Refueling example

- Energy demand per ton positively varies  
with no. of collection stops and with the  
distance

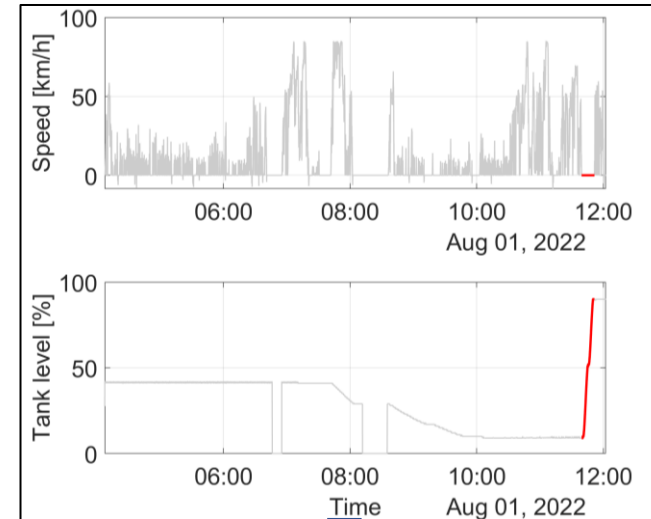
- Route should be classified as
  - Collections per km
  - Collections per ton



# Duisburg, Germany – s2, s3

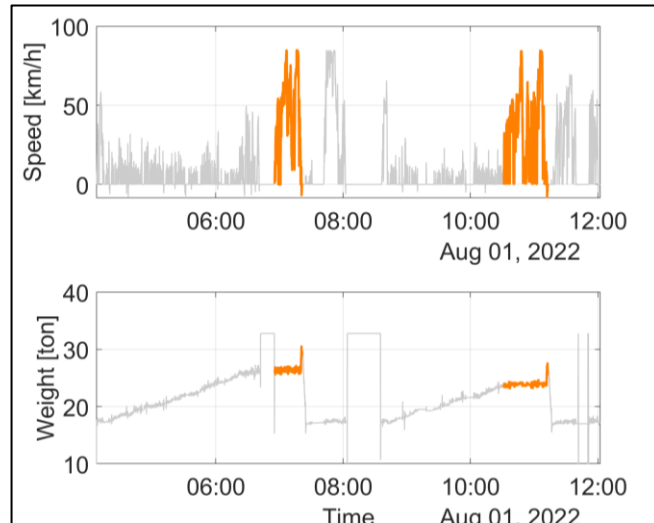


No. of disposals, [-]	2
Time duration, [h]	0,13
Disposed refuse weight, [ton]	15,40
Energy consumed, [kWh]	1,94
Hydrogen consumed, [kg]	0

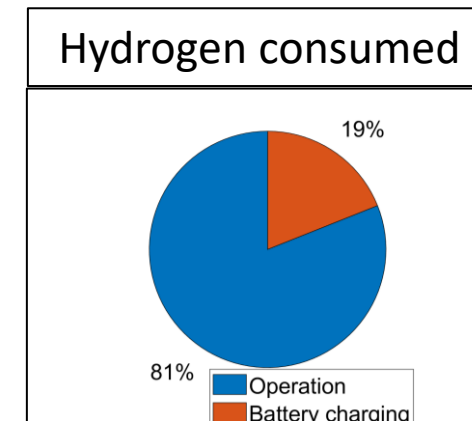
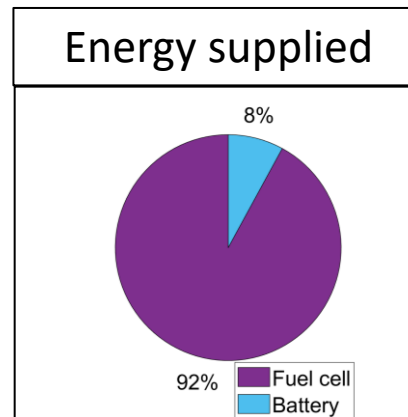
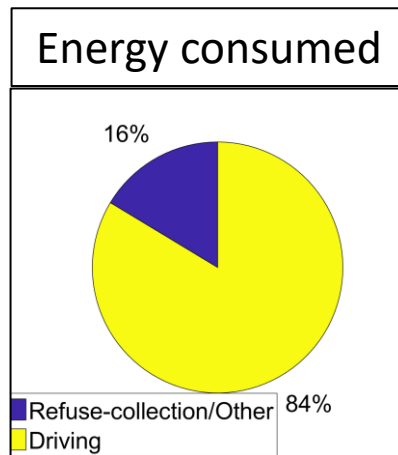


No. of refuels, [-]	1
Time duration, [h]	0,2
Hydrogen refueled, [kg]	12,84

# Duisburg, Germany – Drive to refueling (D2s3)



Average speed, [km/h]	29,96
Time duration, [h]	2,52
Average weight, [ton]	20,45
Distance travelled, [km]	80,97
Energy consumed, [kWh]	94,77
Hydrogen consumed, [kg]	2,28

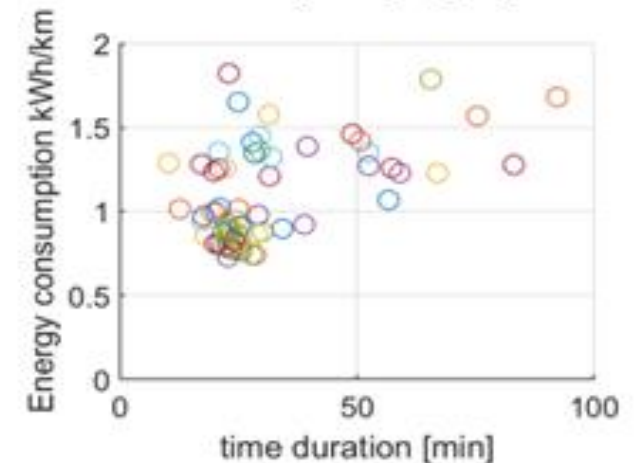
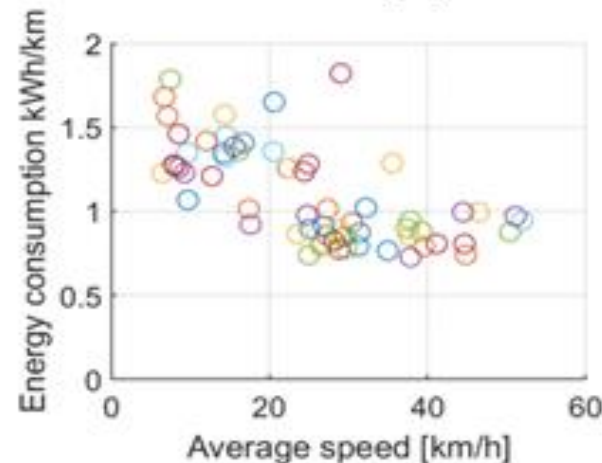
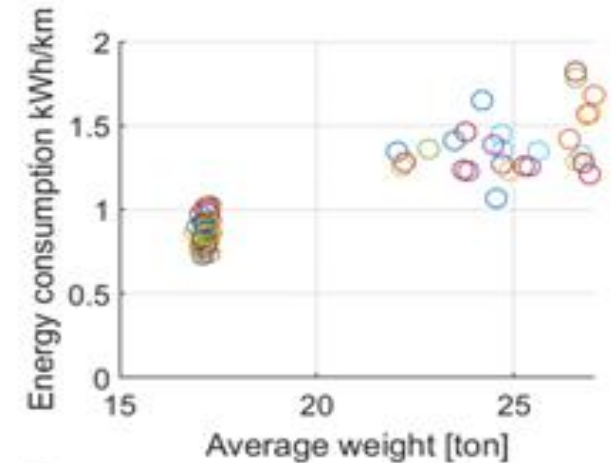
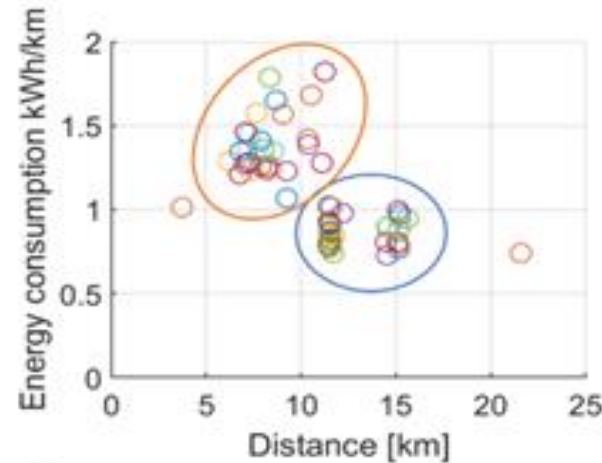




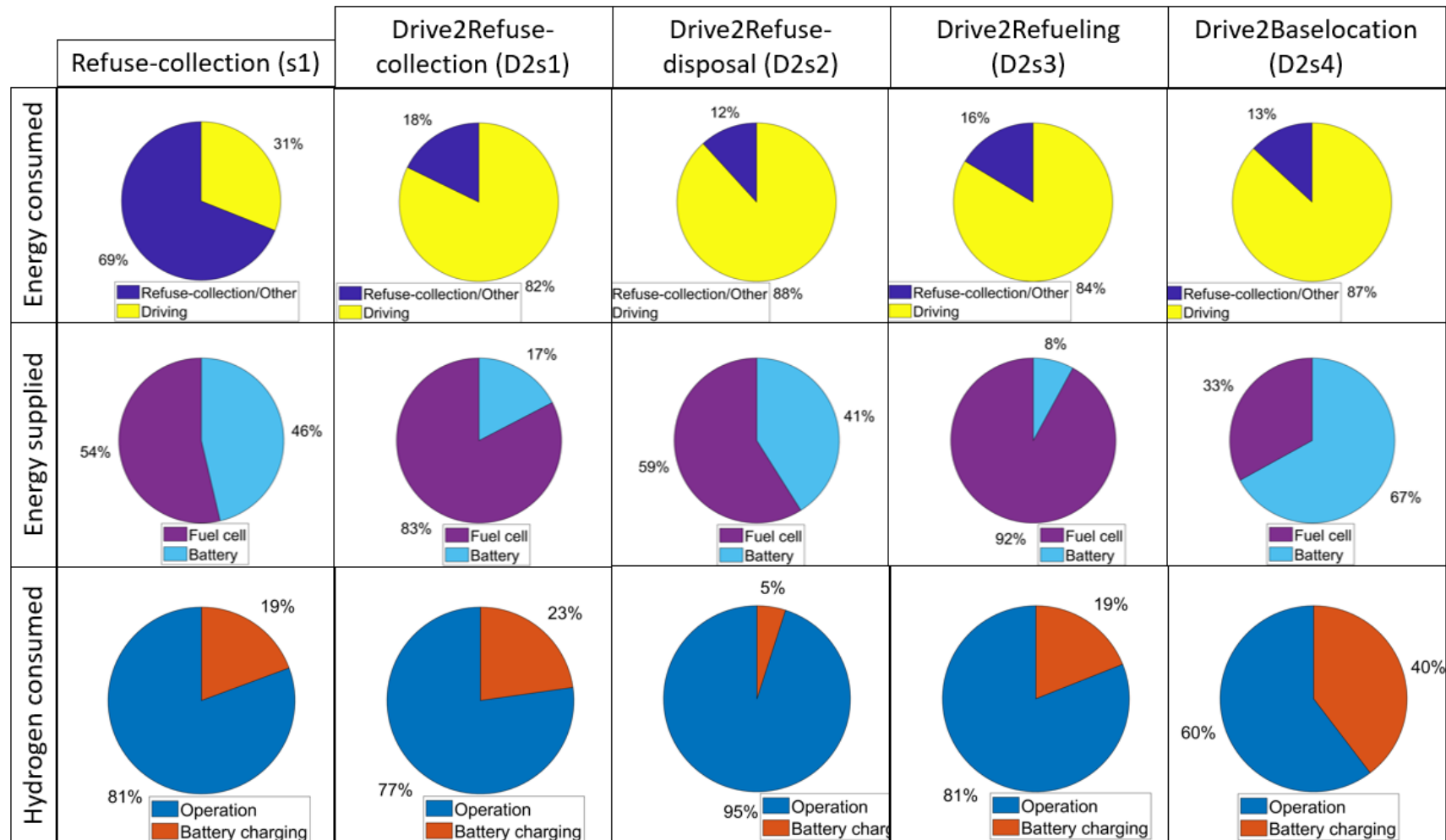
# Duisburg, Germany – Operation: Drive to refueling (D2s3)

2 distinctive types can be seen:

- **Blue eclipse**: After refuse-disposal (lower average weight)
  - Two distinctive route from disposal area to refueling -> see different distances
- **Orange eclipse**: After refuse-collection (varying average weight) and higher energy consumption than the previous one



# Duisburg, Germany – Segments

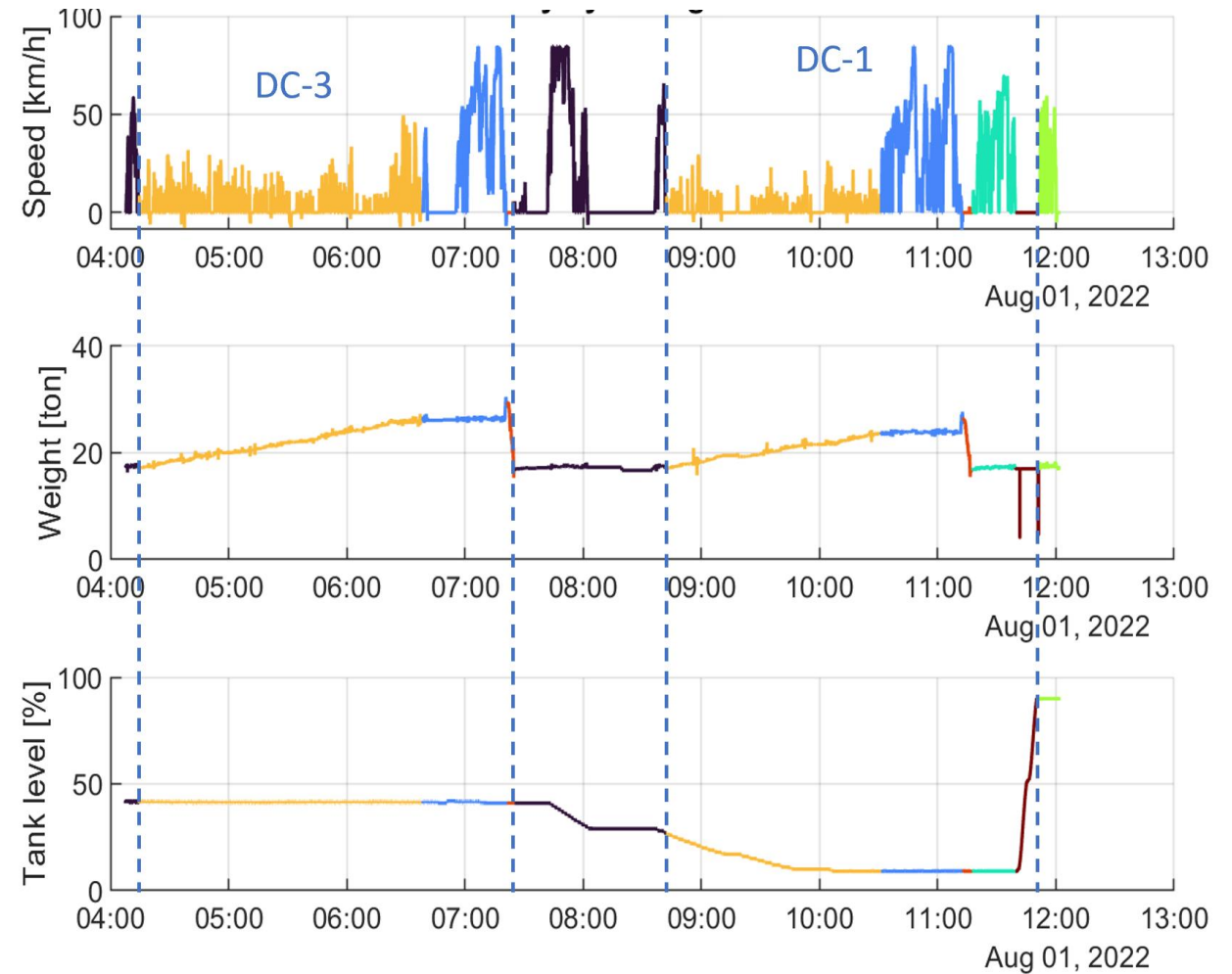


# Duisburg, Germany – Operation duty cycles

- Segments are combined into duty cycles

DC-1	Refuse-collection (s1) $\xrightarrow{\text{D2s2}}$ Refuse-disposal (s2) $\xrightarrow{\text{D2s3}}$ Refueling (s3)
DC-2	Refuse-collection (s1) $\xrightarrow{\text{D2s3}}$ Refueling (s3) $\xrightarrow{\text{D2s2}}$ Refuse-disposal (s2)
DC-3	Refuse-collection (s1) $\xrightarrow{\text{D2s2}}$ Refuse-disposal (s2)
DC-4	Refuse-collection (s1) $\xrightarrow{\text{D2s3}}$ Refueling (s3)
DC-5	Refuse-collection (s1)

**D2s1 -> DC-3 -> D2s1 -> DC-1 -> D2s4**

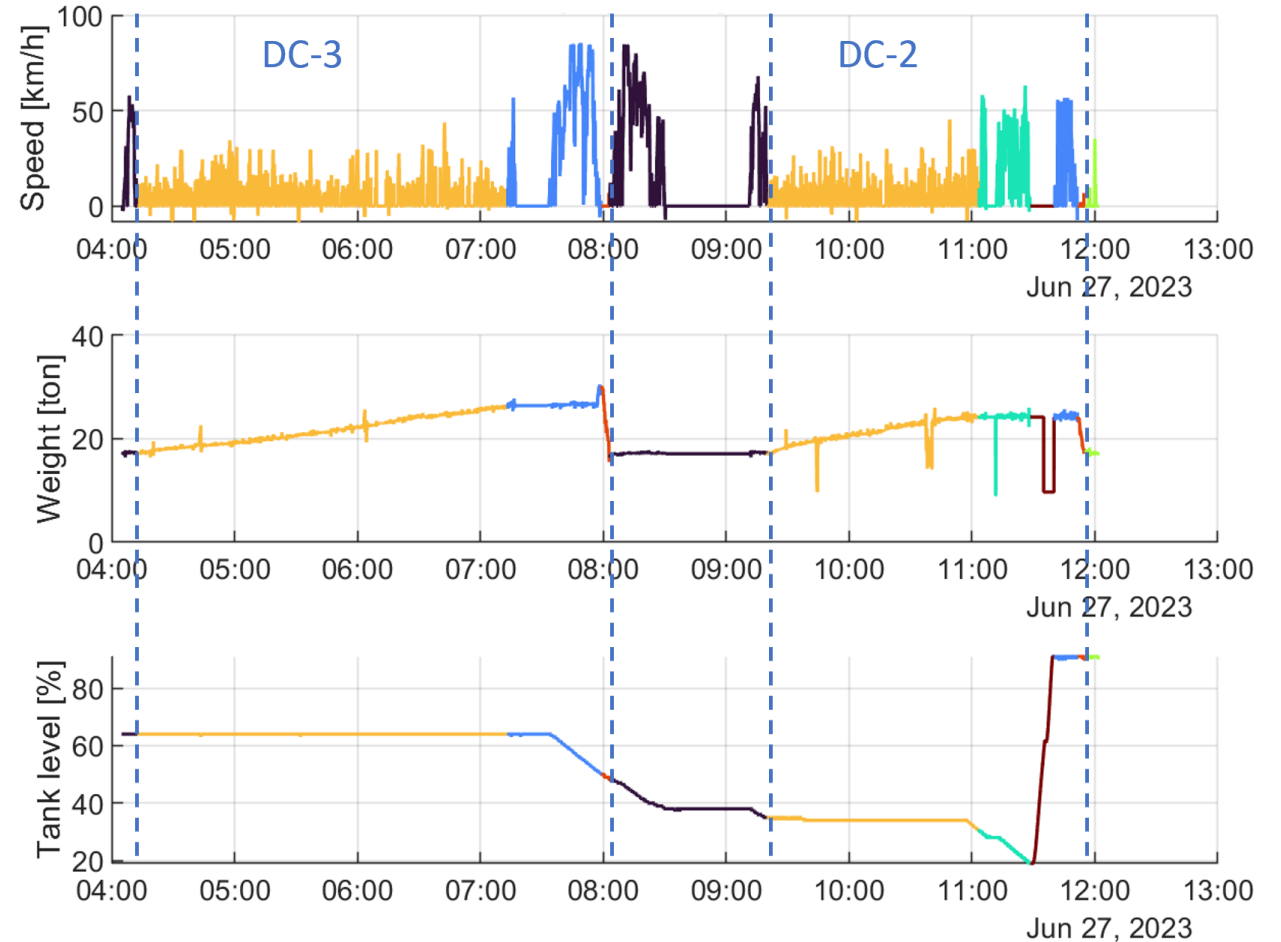


# Duisburg, Germany – Operation duty cycles

- Segments are combined into duty cycles

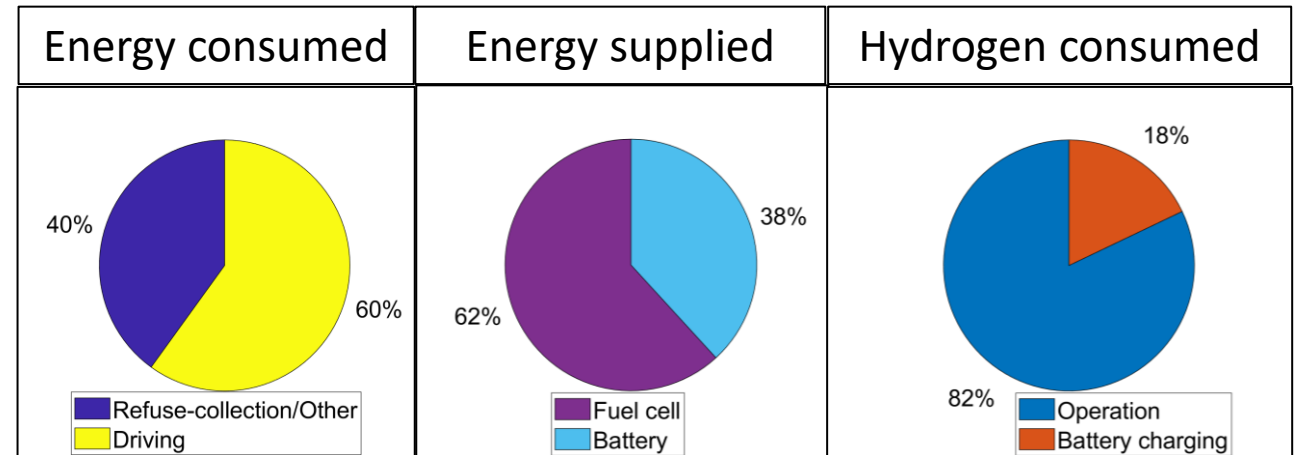
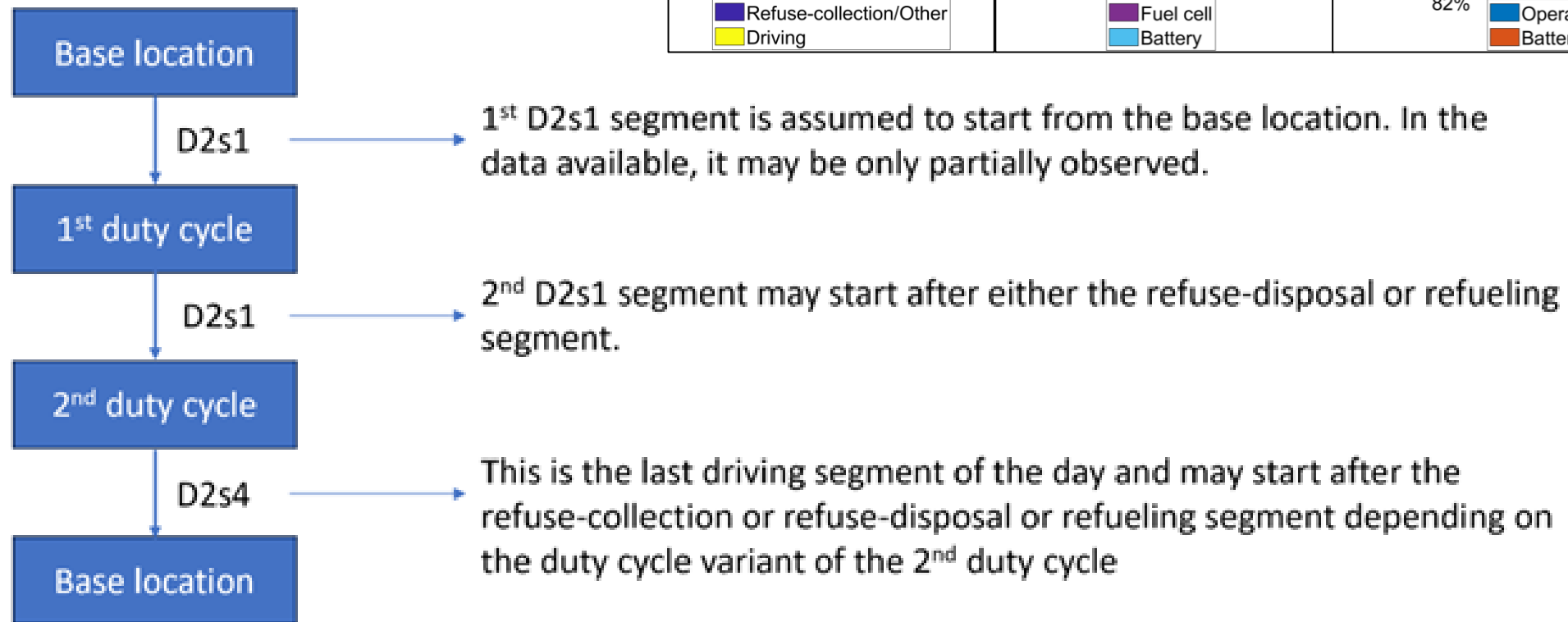
DC-1	Refuse-collection (s1) $\xrightarrow{D2s2}$ Refuse-disposal (s2) $\xrightarrow{D2s3}$ Refueling (s3)
DC-2	Refuse-collection (s1) $\xrightarrow{D2s3}$ Refueling (s3) $\xrightarrow{D2s2}$ Refuse-disposal (s2)
DC-3	Refuse-collection (s1) $\xrightarrow{D2s2}$ Refuse-disposal (s2)
DC-4	Refuse-collection (s1) $\xrightarrow{D2s3}$ Refueling (s3)
DC-5	Refuse-collection (s1)

D2s1 -> DC-3 -> D2s1 -> DC-2 -> D2s4



# Duisburg, Germany – Operation day

- Generic day representation using duty cycles

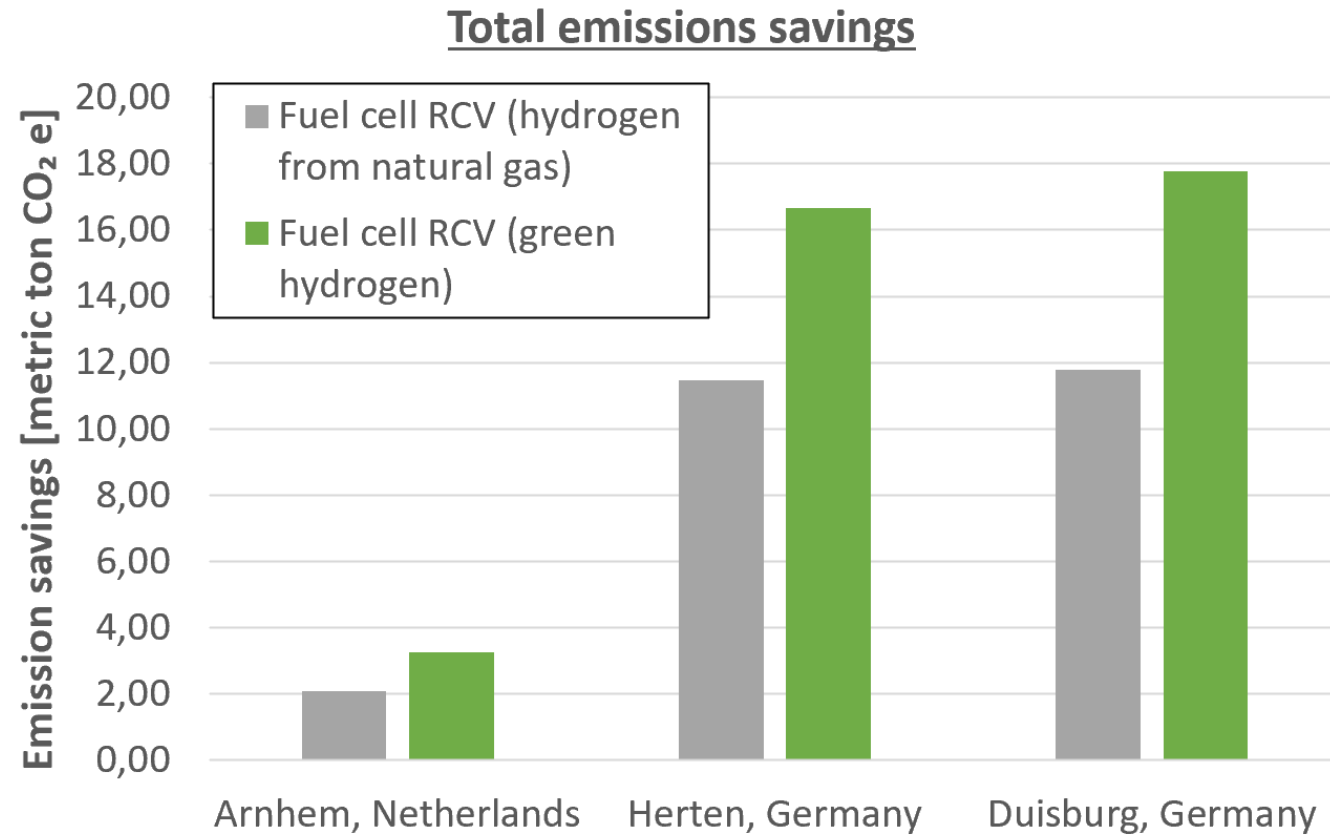


# Comparison of Vehicles

Category	Metric	Arnhem, NL	Duisburg, DE	Herten, DE
Distance [km]	Daily average	58.04	82.51	81.73
	Total	1857.4	8663.5	8010
H2 Use [kg]	Daily average	6.15	6.49	11.22
	Total	196.92	700.5	1099.62
H2 Consumption [kg/100km]	Daily average	11.82	7.58	13.62
Energy Consumption [kWh/km]	Daily average	1.71	1.86	1.75
H2 Refuel	Average per [kg]	6	11.33	12.22
	Number	9	65	55
	Average time [min]	17.44	12.65	10.84
Operation	Total days	32	108	80

# Estimated emission savings within the analysis period

In comparison to diesel RCV



# Learnings from project/conclusion

- Include manufacturers in project to incentivise sharing of data
- Ensure good pipeline with clean and consistent data organised before vehicle contract signed



# Future research – Data utility

- Data-based modelling:
  - Predict/forecast a sequence of duty-cycle segments **optimized for fuel/energy consumption** using the following high-level inputs:
    1. Refuse-collection route optimization
    2. H2 level at the start of the daily operation
    3. Battery SoC at the start of the daily operation
  - **Route optimization**, refuse-collection authorities:
    1. Plan refuse-collection operation for an area optimized for fuel/energy consumption and operational (refuse-collection) requirements
    2. Assess the feasibility of operating H2-fueled refuse-collection vehicles on unknown routes

# Future research - Data utility

- Grey-box modeling approach based on the current analysis
  - further optimization at low-level, e.g., energy management strategy
  - From segment-based prediction to real-time (time-series) based prediction
- Adoption of performance-based standards for RCVs
  - Acceleration capability
  - Startability and gradability for operation on hilly routes