

# APPLYING DATA SCIENCE ON CHARGING INFRASTRUCTURE BENCHMARKING 5 REGIONS IN THE NETHERLANDS

**AVERE E-mobility conference**

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Session: *Interoperability of charging infrastructure*

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CREATING TOMORROW





## AMSTERDAM

Start	<i>febr 2012</i>
Charge Stations	824
Charge Sessions	901.390
Monthly	42.643

## UTRECHT

Start	<i>dec 2013</i>
Charge Stations	263
Charge Sessions	169.166
Monthly	11.601

## THE HAGUE

Start	<i>juni 2013</i>
Charge stations	429
Charge Sessions	217.872
Monthly	15.664

## METROPOLE REGION

Start	<i>feb 2014</i>
Charge Stations	722
Charge Sessions	390.423
Monthly	51.121

## ROTTERDAM

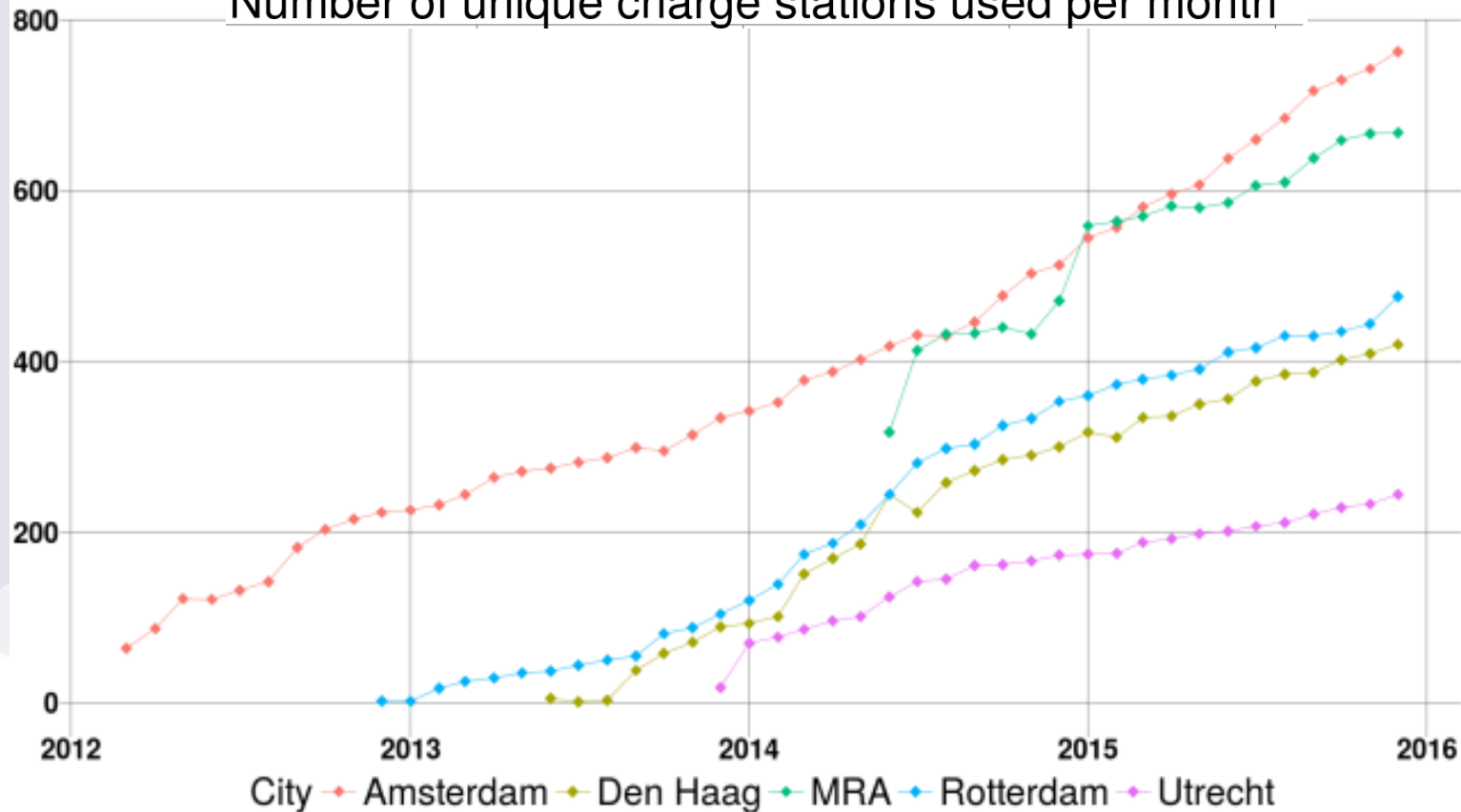
Start	<i>dec 2012</i>
Charge Stations	~500
Charge Sessions	288.924
Monthly	19.079

## GRAND TOTAL

Charge Stations	<b>2855</b>
Charge Sessions	<b>1.967.775</b>
Monthly	<b>140.108</b>

# #CHARGING STATIONS USED MONTHLY: STEADY INCREASE

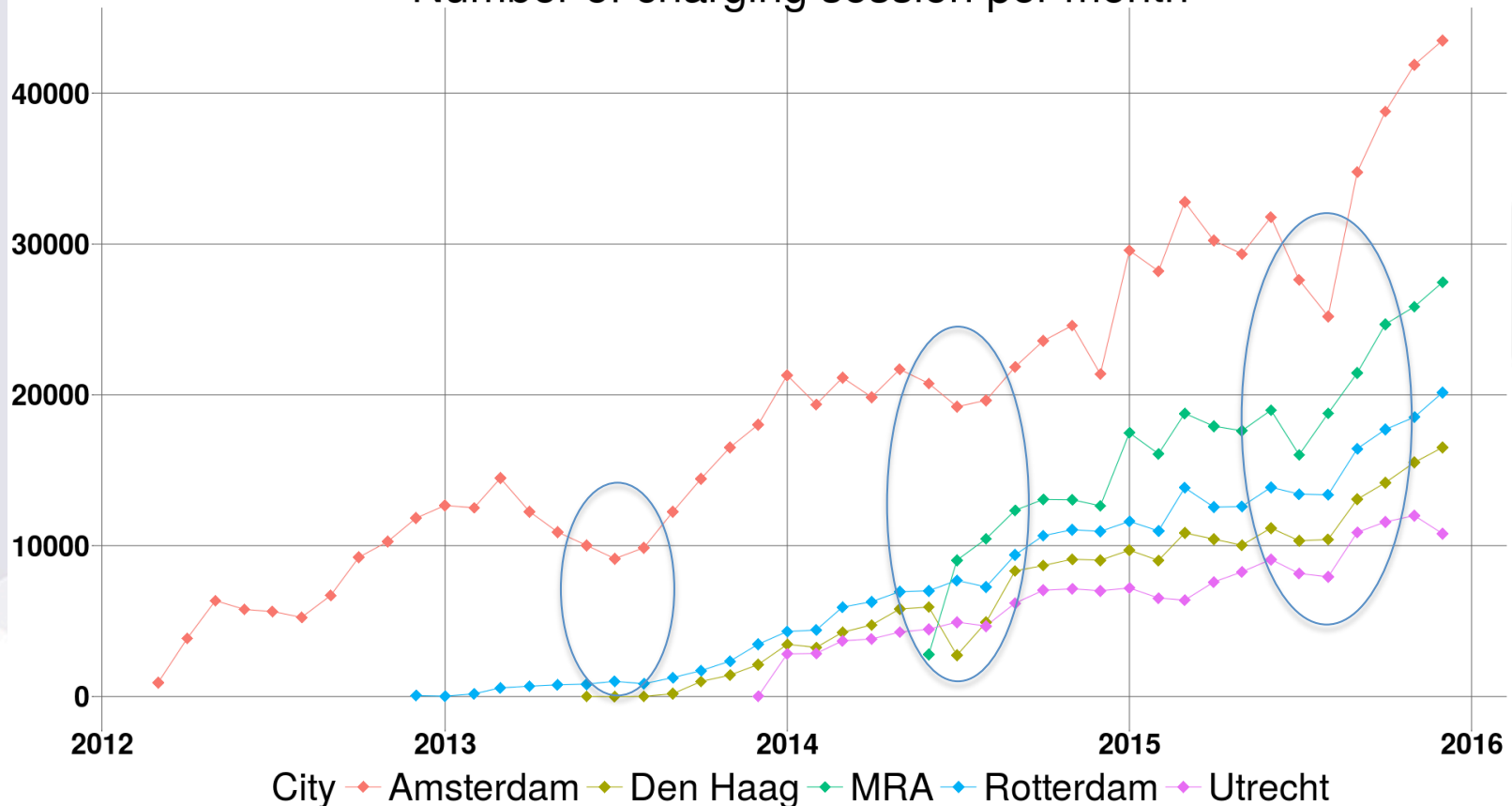
Number of unique charge stations used per month



- Amsterdam and MRA leading
- Den Haag and Rotterdam close followed by Utrecht

# #CHARGING SESSIONS MONTHLY

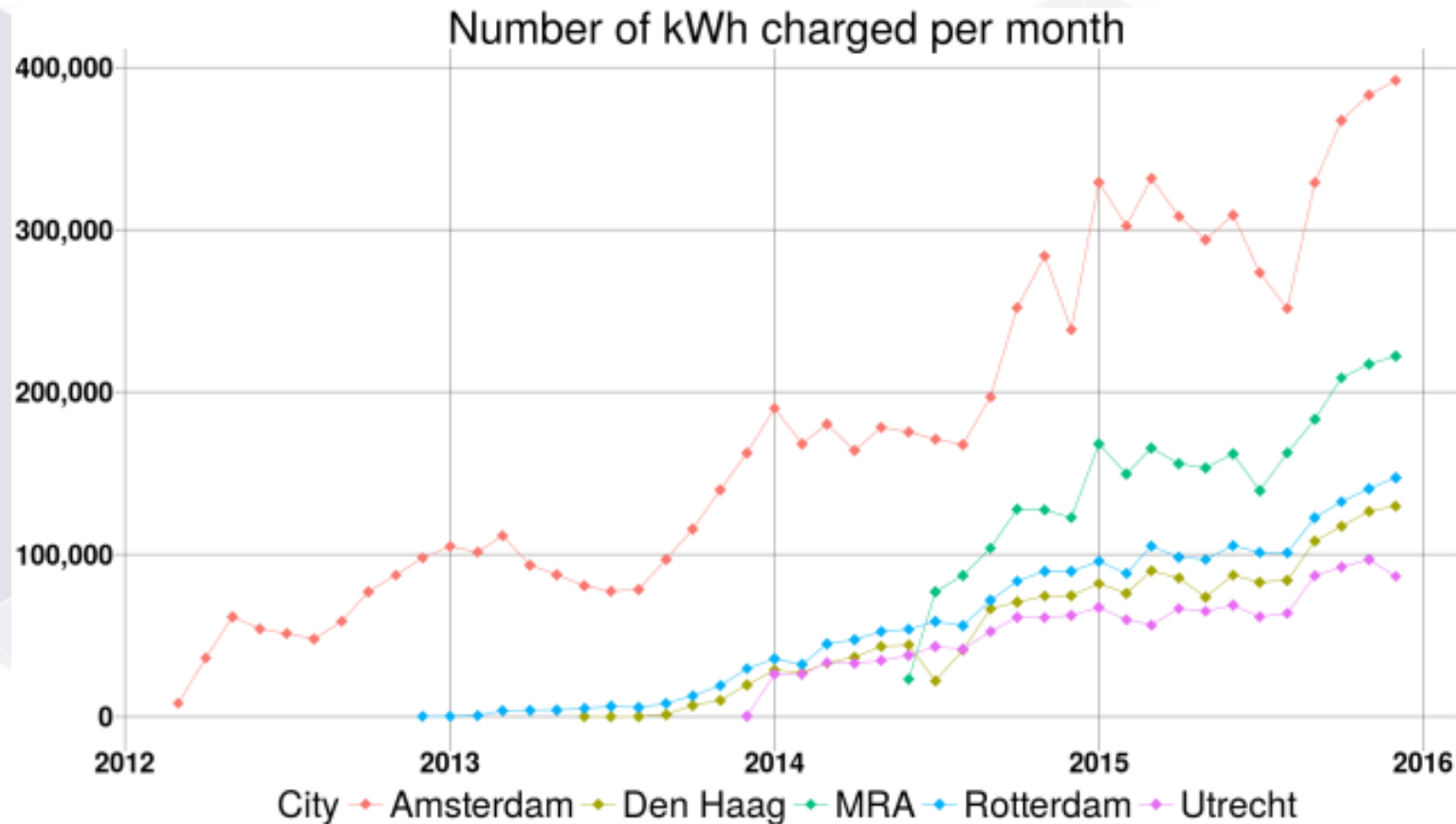
Number of charging session per month



- Variance from 12.000-20.000 (Utrecht, Den Haag, Rotterdam) to 40.000 (Amsterdam) sessions per month
- Seasonal influences

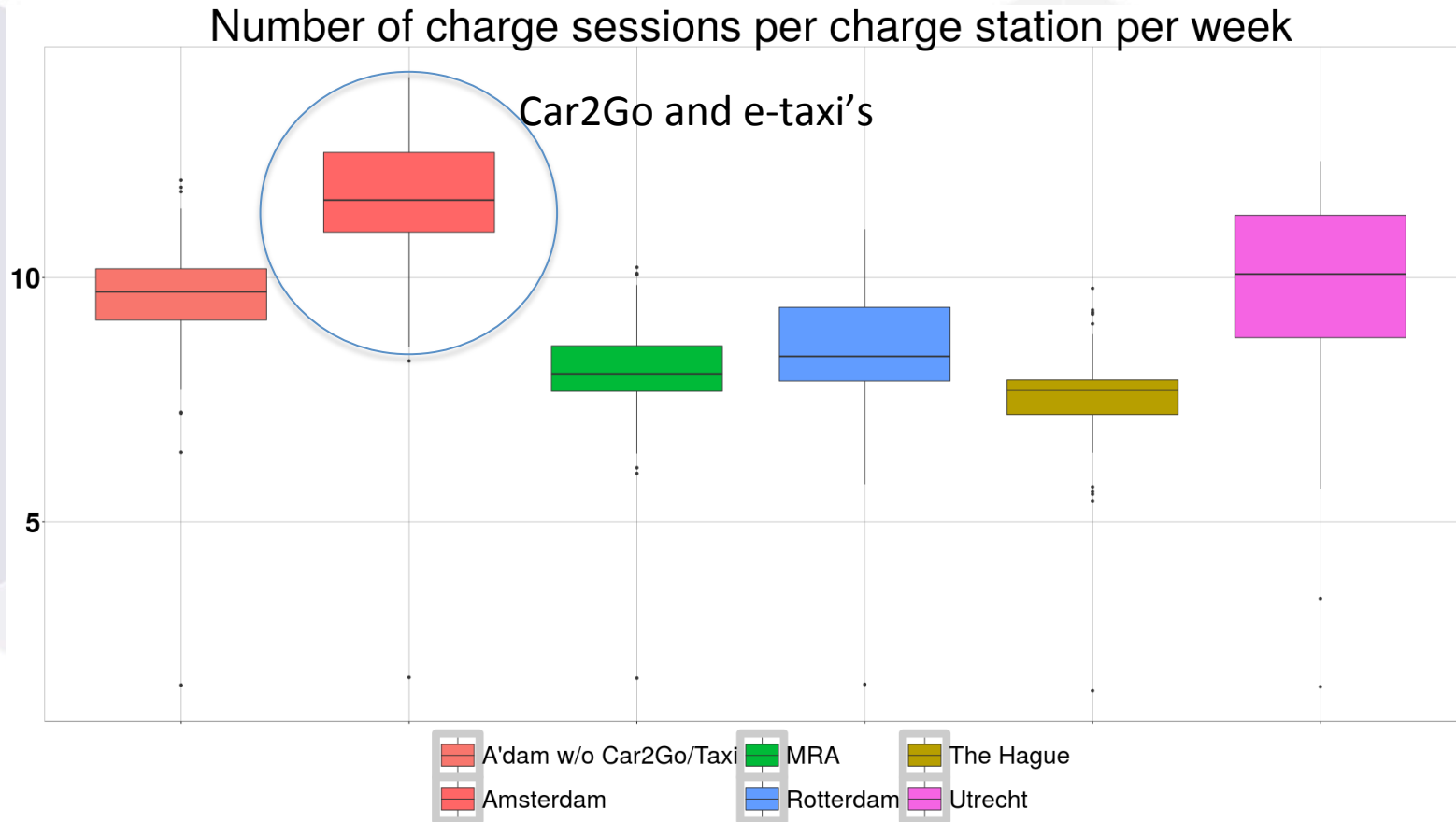


# ELECTRICITY CHARGED (KWH)



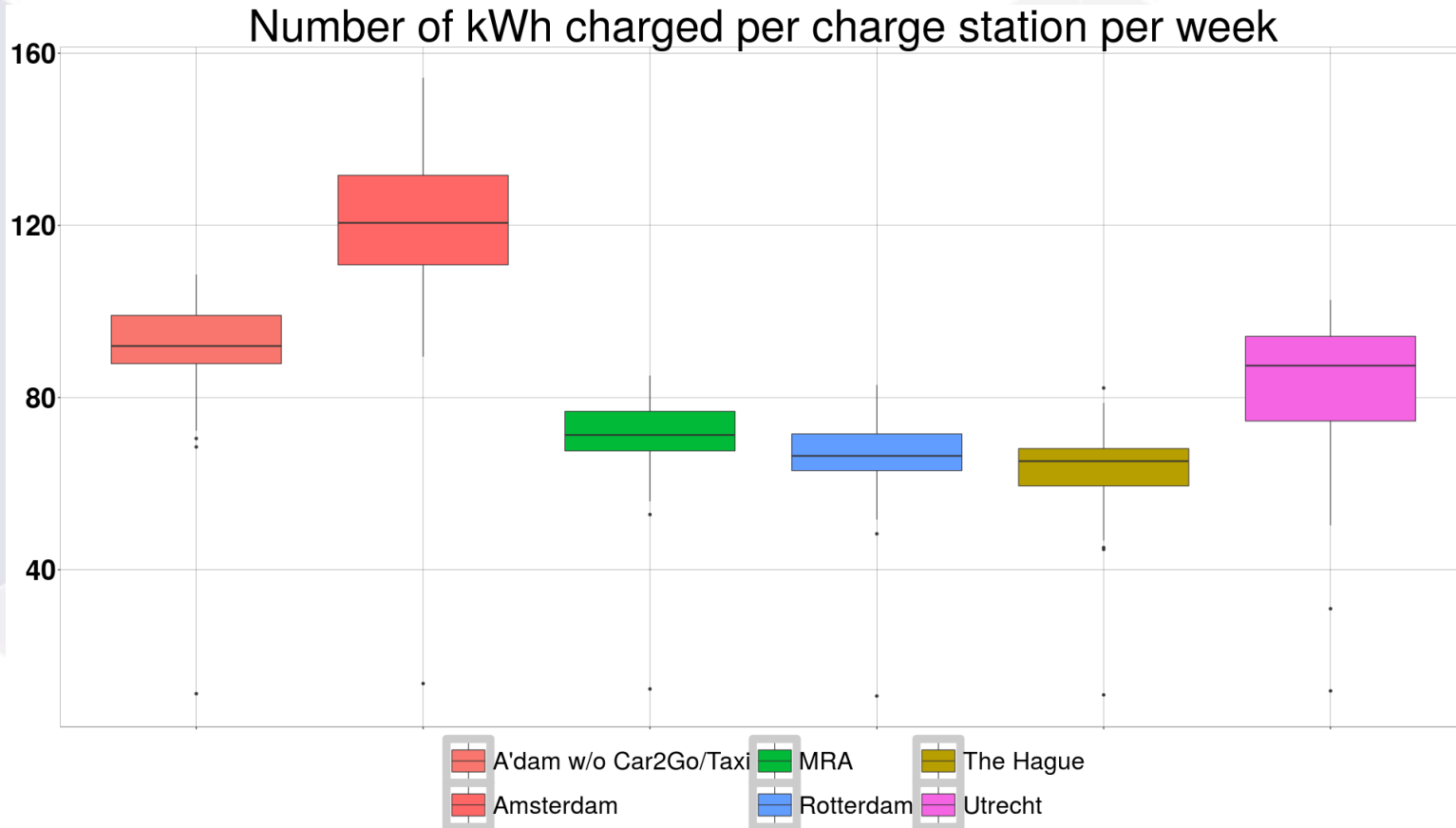
- Monthly between 100 MWh (Utrecht, Den Haag, Rotterdam) to 400MWh (Amsterdam) charged

# CHARGE SESSIONS PER CHARGE STATION



- Relative high scores for Amsterdam and Utrecht
- Car2Go increase # of sessions by ~25%

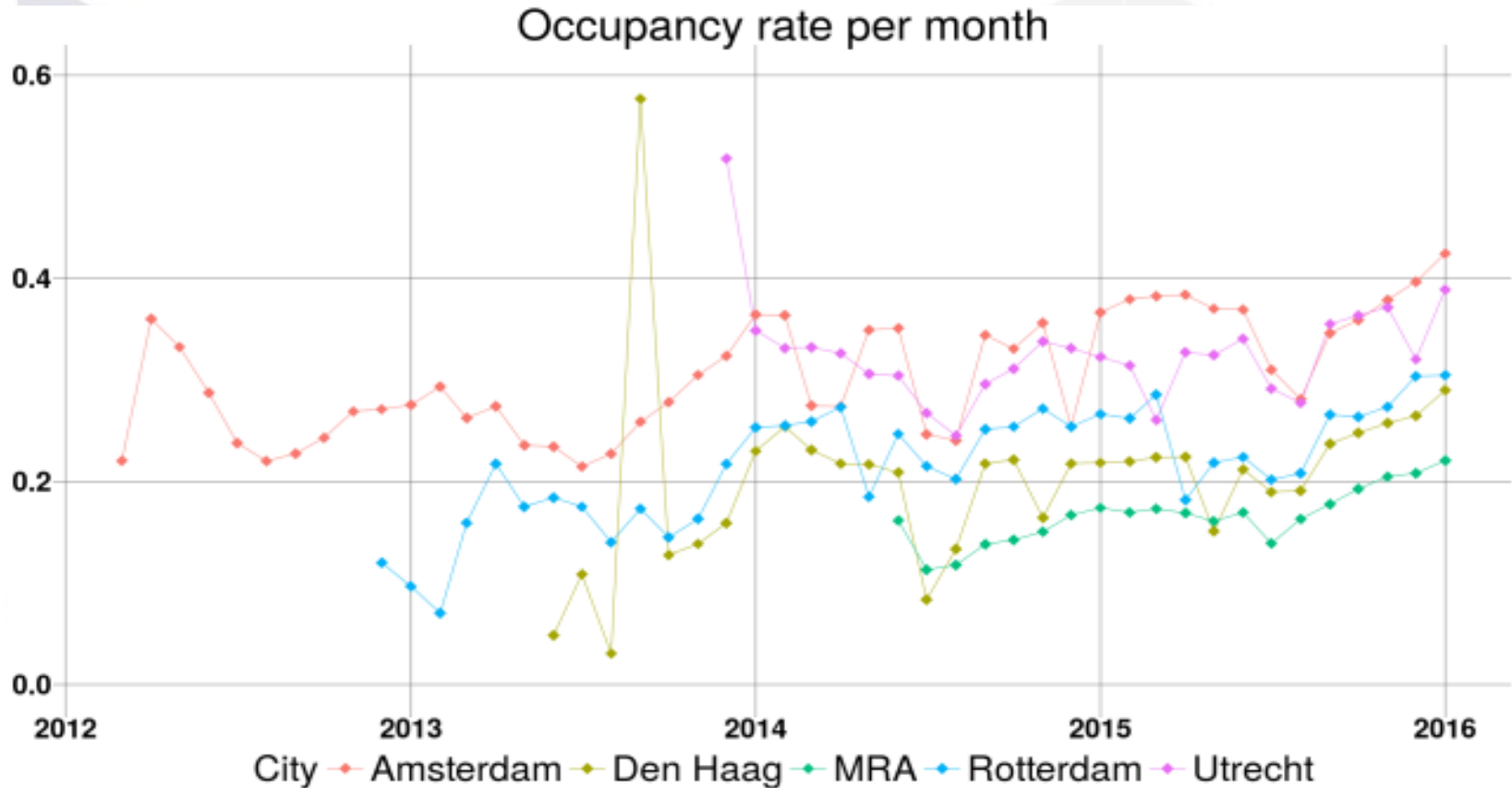
# 70-120KWH CHARGED PER WEEK PER CHARGE STATION



- Again: high averages in Amsterdam and Utrecht

# TO WHAT EXTENT ARE CHARGING POINTS OCCUPIED?

## OCCUPANCY RATE BETWEEN 20% AND 40%



- Occupancy rate at peak times can be very high.
- Note that *charging rate* is (significantly) lower than occupancy rate

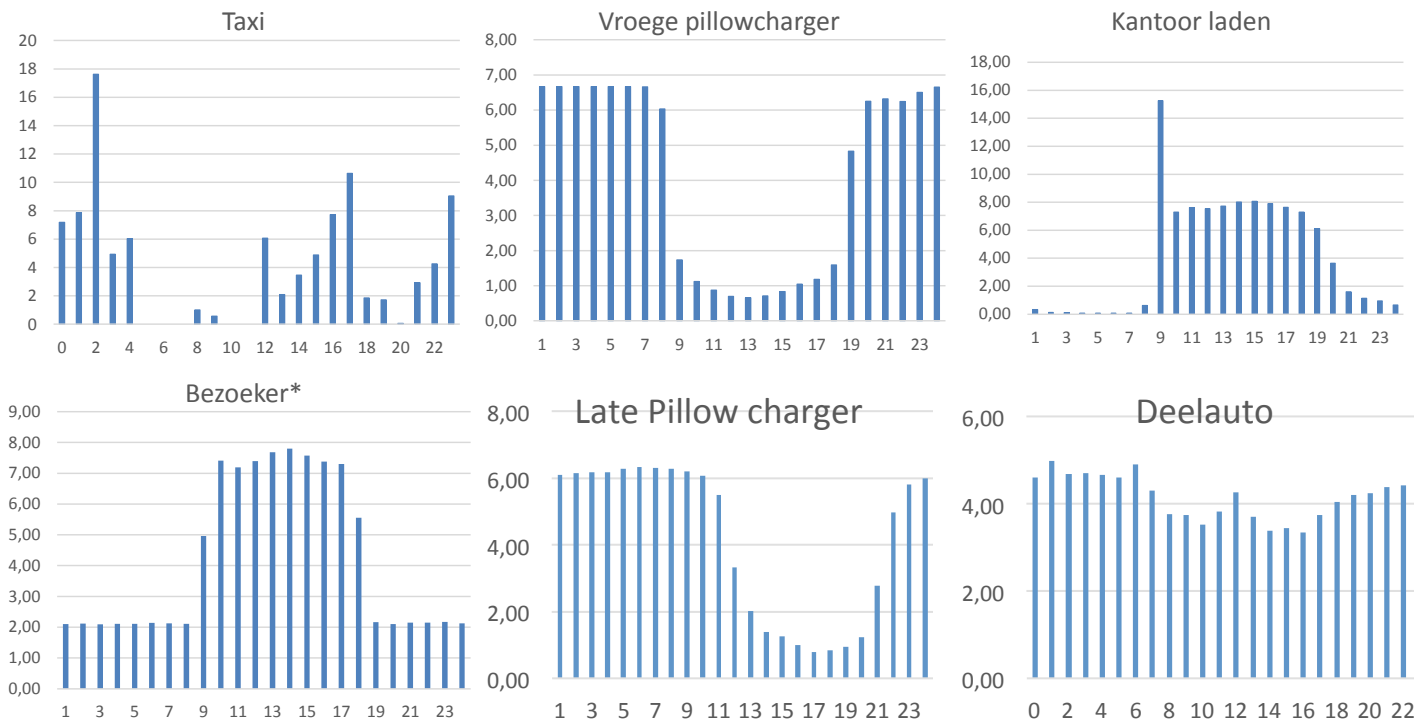
# CONCLUDING BENCHMARK

Success factors:

- Car2Go (Amsterdam)
- Electric taxis (Amsterdam)
- Dense/urban areas (Amsterdam)
- High level of active users / ~income? (Utrecht, Amsterdam)
- Relative scarcity of charging points (relative to # of users) (Utrecht)
- On-demand placement (versus strategic placement) (most cases)

Importance of deeper analysis of charging patterns.

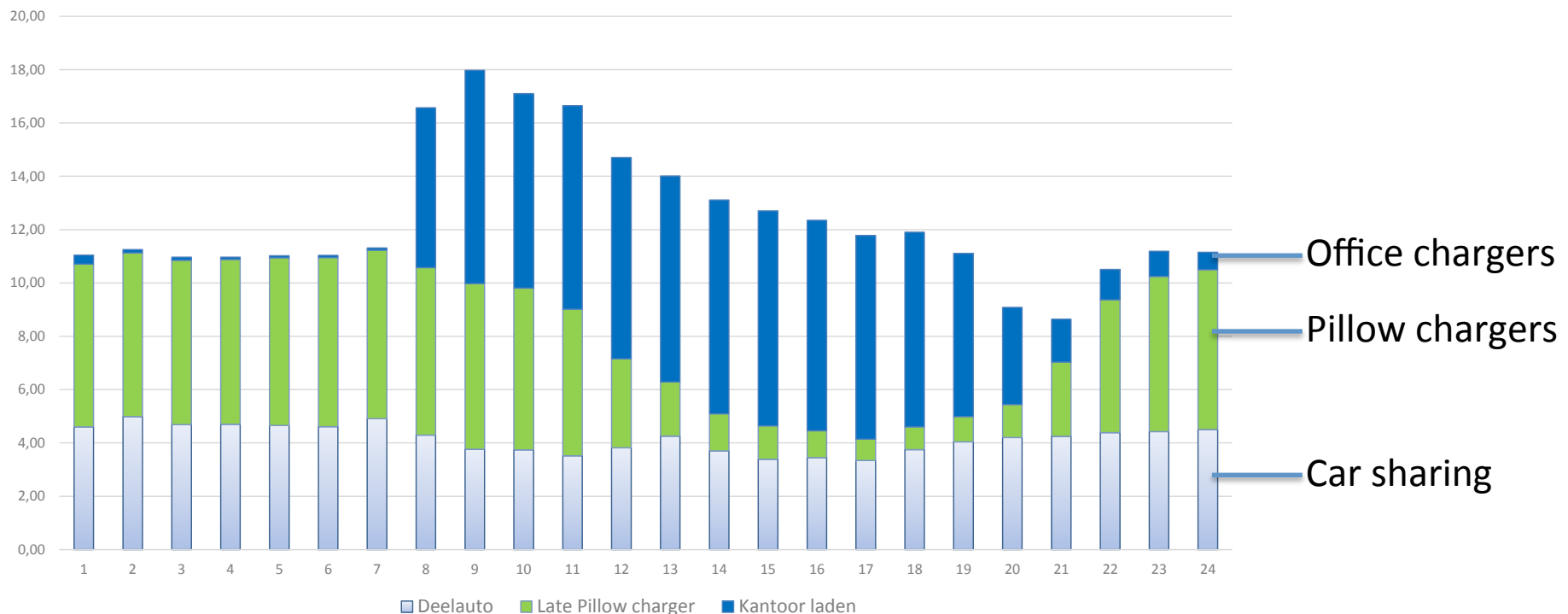
# CHARGING PROFILES OF USERS: DISTINCT DIFFERENCES CAN BE SEEN IN HOW PEOPLE CHARGE



- Major part of EV user population is highly predictable.
- Can support in optimizing charging infrastructure

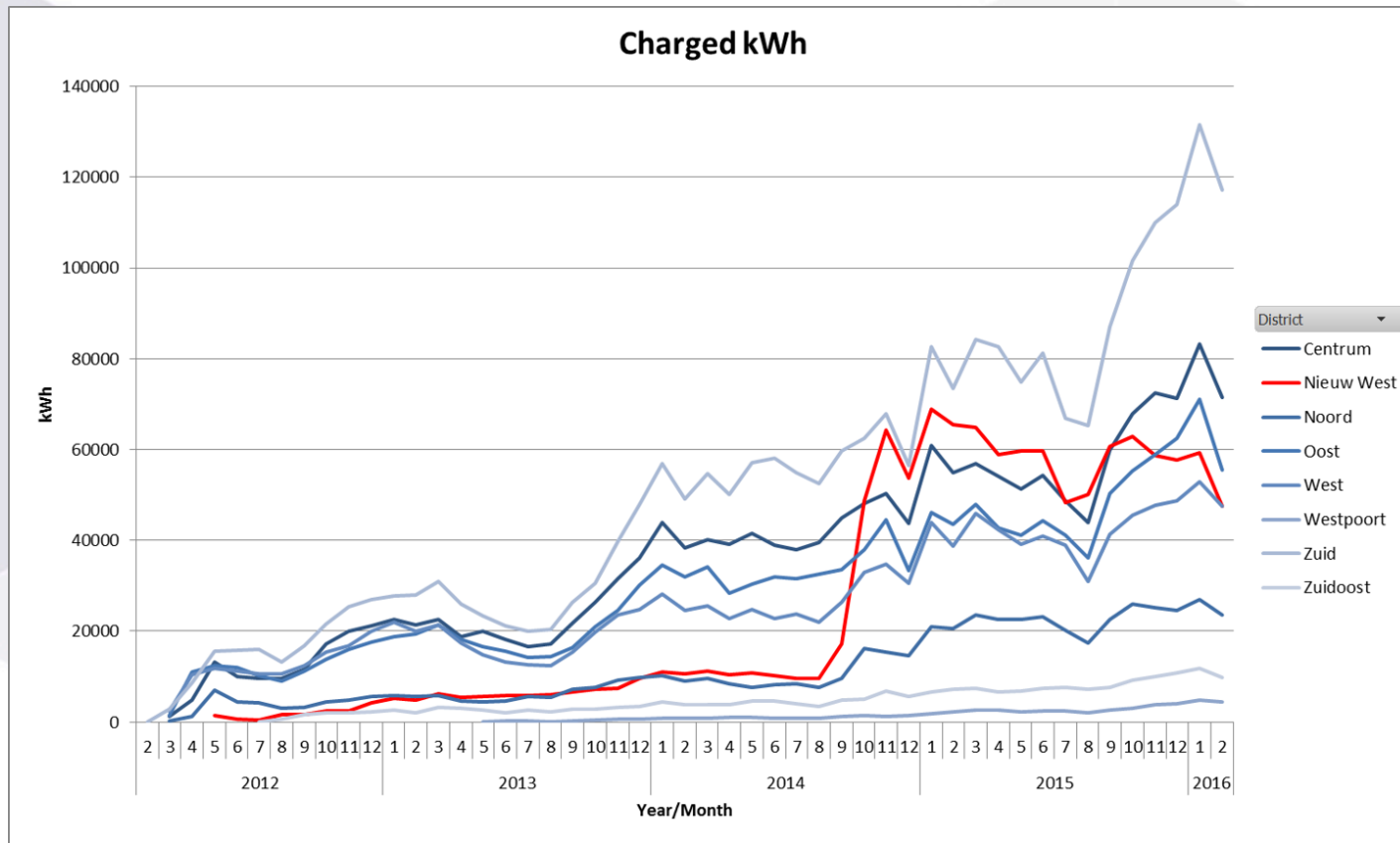


# SMART ROLL-OUT STRATEGIES: OPTIMIZING LOCATIONS SELECTION



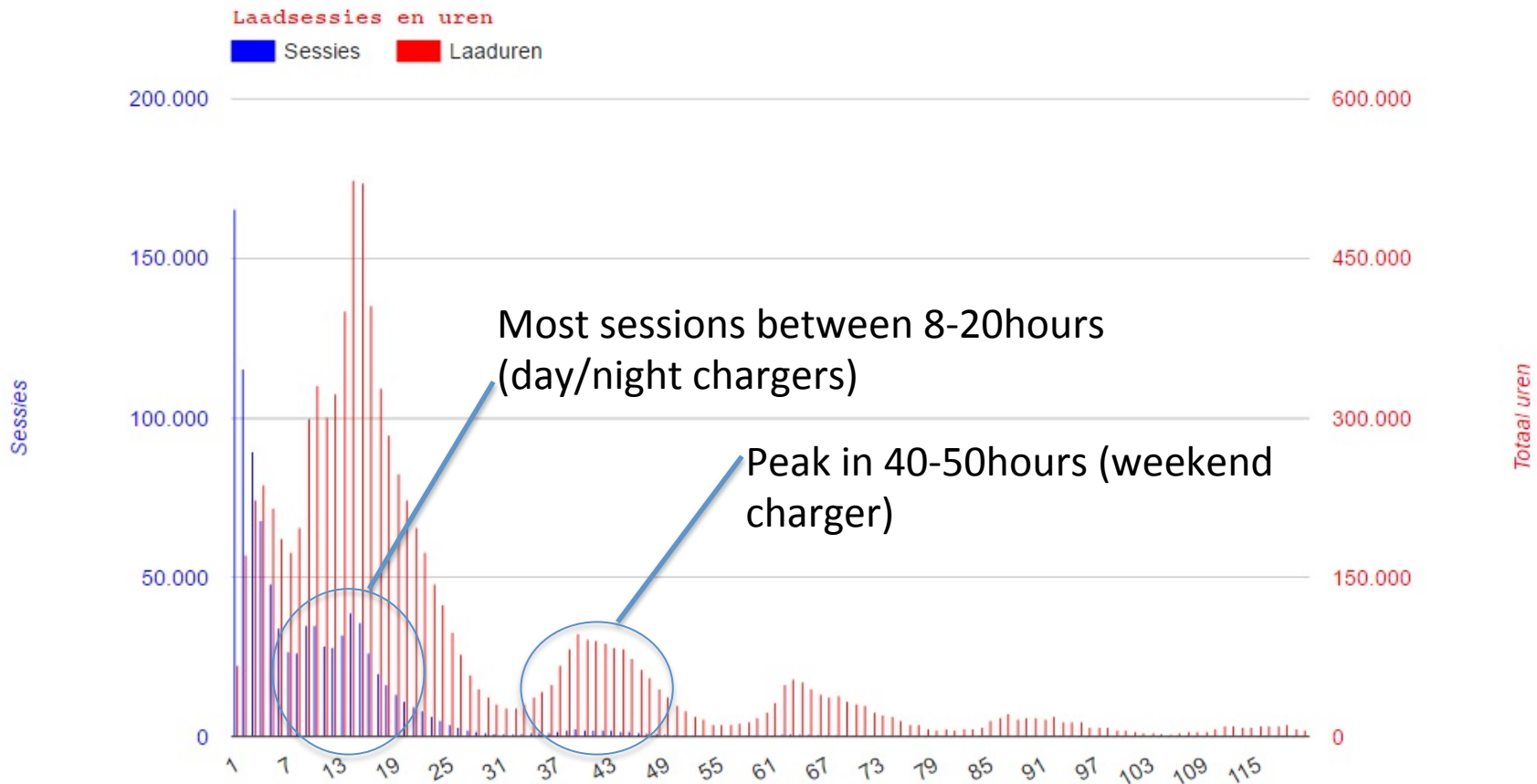
- Selecting locations with multiple user profiles
- Understanding utilization of charging infra, requires insight in user profiles

# USER SEGMENTS: ILLUSTRATION



- 80 commissioned electric taxi's responsible for 4-fold increase in kWh charged in an Amsterdam district (new west)

# THE ISSUE OF LONG-CHARGERS

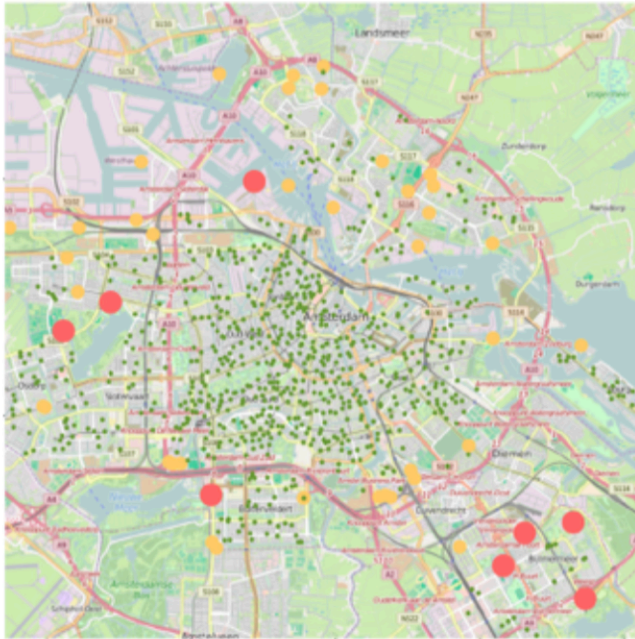


- <3% of all charge sessions responsible for 20% of occupation
- Incentives or social charging initiatives can improve effectiveness

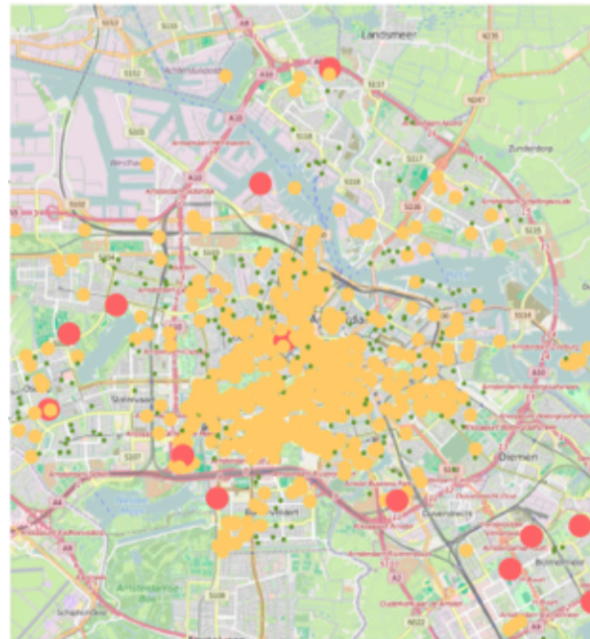
# VULNERABILITY OF CHARGE INFRASTRUCTURE:

*CAN I CHARGE MY CAR IF MY PREFERRED CHARGING POINT IS NOT AVAILABLE?*

Amsterdam – December 2015 45.000 charging sessions



First Order Vulnerability: available alternative for start time of charge session



Second Order Vulnerability: available alternative for full charge session



< 5 failures



5 < 40 failures

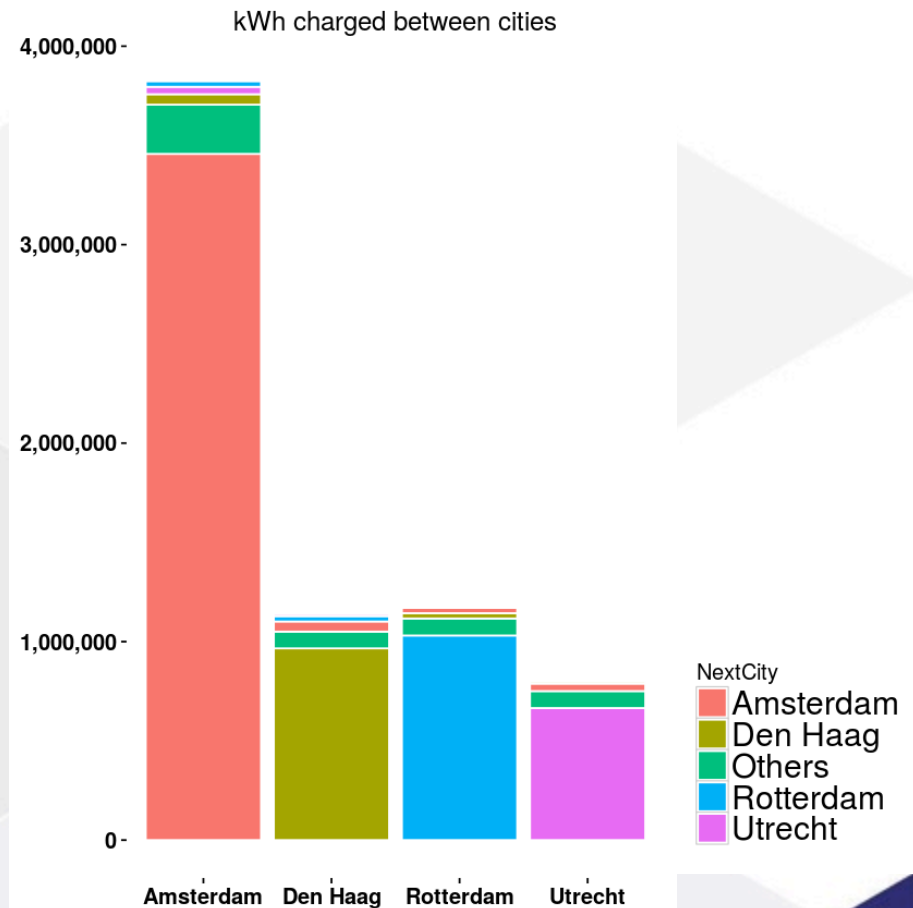
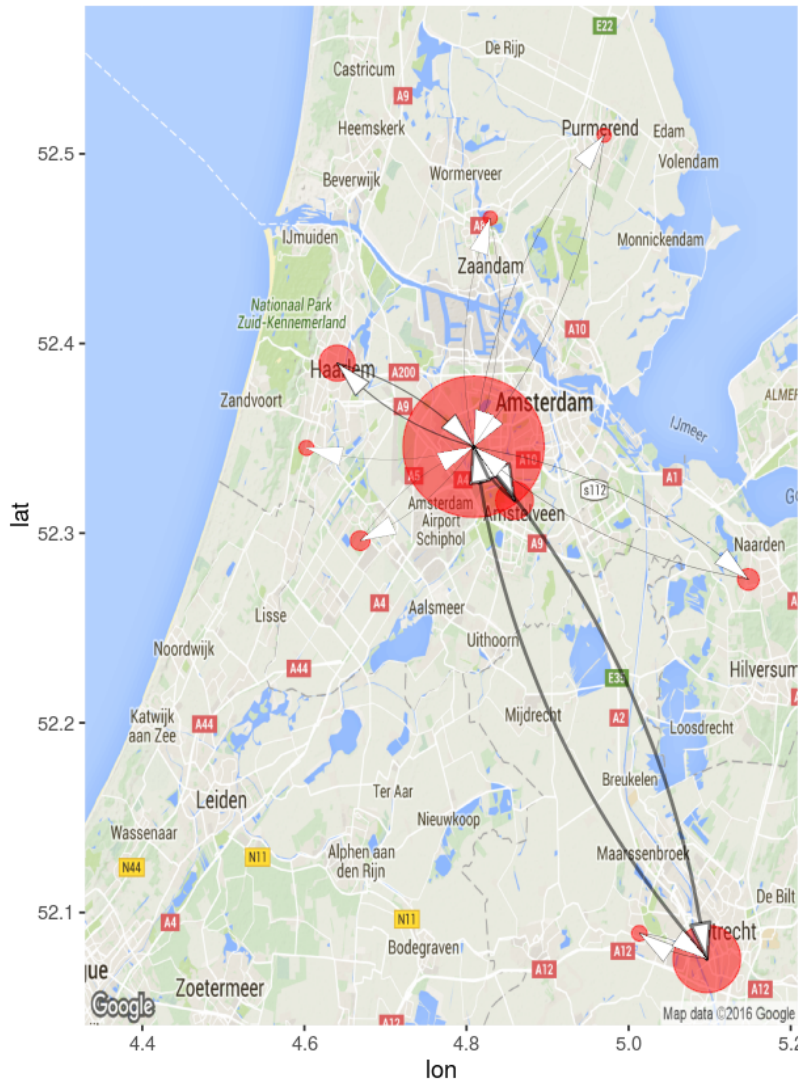


> 40 failures

**failure:** No relevant charge station within a radius of 500m is available

- Vulnerability analysis can support in deciding logical new charging station locations

# INTERCITY TRAFFIC: LARGE CITIES HAVE SUPPORTING ROLE FOR SUBURBS





# CONCLUDING

- Instrumental role of data science in roll out of charging infrastructure:
  - Monitoring
  - Benchmarking
  - Pattern recognition
  - Anomaly detection
  - Forecasting
  - Simulation
  - Policy evaluation
- For more information: **[www.idolaad.nl](http://www.idolaad.nl)**

