
ESTIMATION OF PUBLIC CHARGING DEMAND USING CELLPHONE DATA AND POINTS OF INTERESTS- BASED SEGMENTATION

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INTRODUCTION

THE NEED OF CHARGING INFRASTRUCTURE

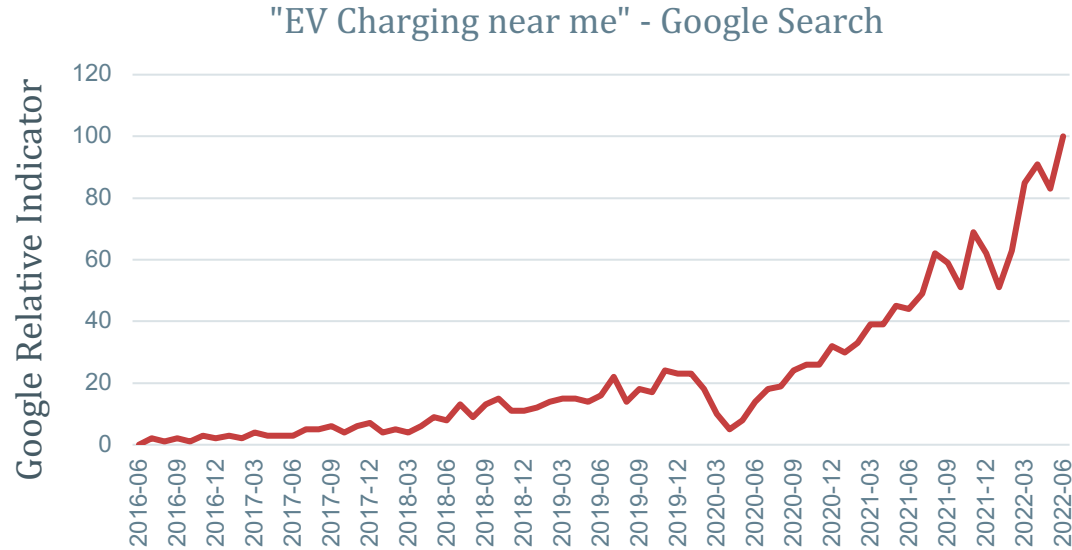


Lawmakers back EU-wide ban on new fossil fuel cars from 2035, despite strong lobbying

Lawmakers in the European Parliament's environment committee voted to uphold a proposed ban on the sale of polluting vehicles from 2035 but narrowly rejected proposals for stricter 2030 targets on cars and vans that would have made the transition smoother.

INTRODUCTION

THE NEED OF CHARGING INFRASTRUCTURE



INTRODUCTION

How can we leverage data analytics to help the development of charging infrastructure roll-out strategies ?



WHERE ?

Where should the chargers be built?

HOW MANY ?

How many chargers should be built?

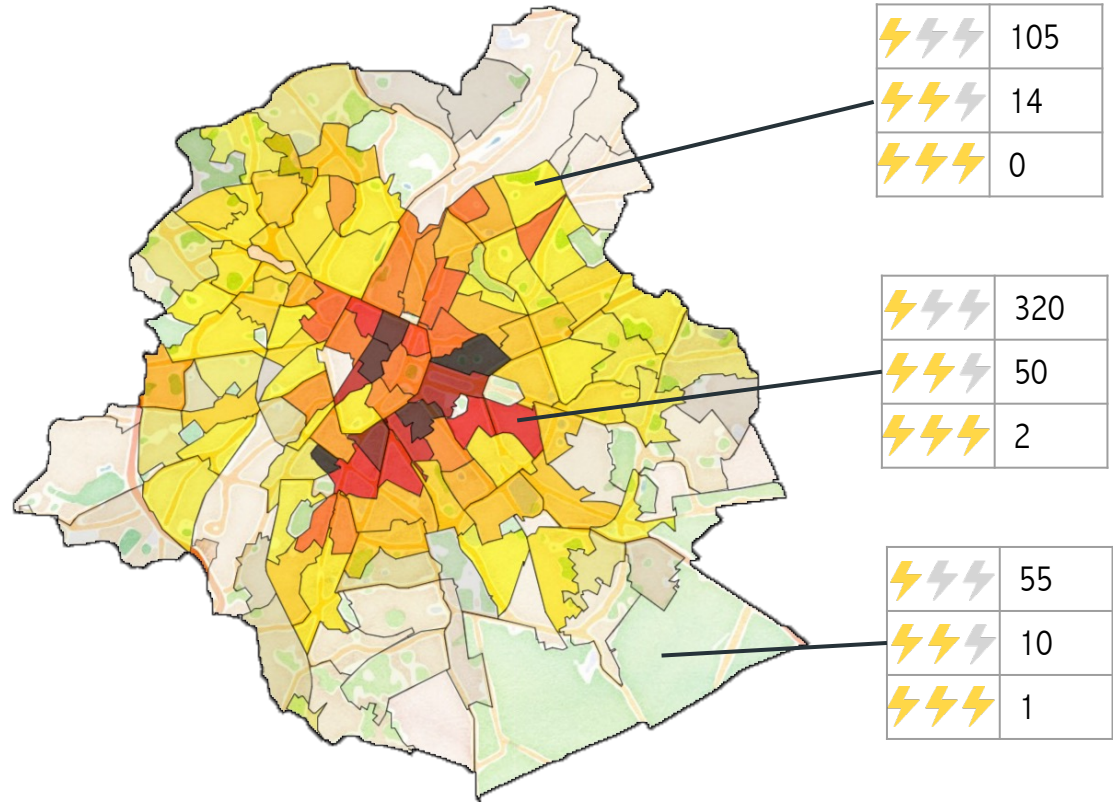
WHICH ?

Which type of chargers should be built?

WHERE ?

HOW MANY ?

WHICH ?



⚡⚡⚡ Normal

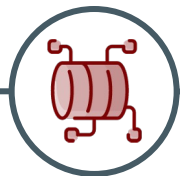
⚡⚡⚡ Semi-Rapid

⚡⚡⚡ Fast

METHOD

PROPOSED PIPELINE

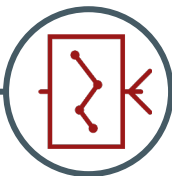
WHERE?



1| Granularity

Balance between precision and computational performance.

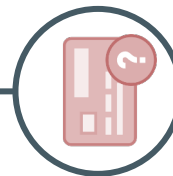
HOW MANY?



2| Demand Estimation

Estimate the charging needs of each zone

WHICH ?



3| Demand Segmentation

Segmentate the demand into the existing charging technology

CASE STUDY: BRUSSELS

KEY NUMBERS

2030 All diesel vehicles
forbidden in BCR

2035 All thermic vehicles
forbidden in BCR

22 000 Tomorrow, 2035:
public charging points



1000 Today, 2022:
public charging points



01 GRANULARITY

Balance between data availability,
computational resources and performance.



(a) Municipalities



(b) Neighborhoods



(c) Statistical Sectors

02 DEMAND ESTIMATION

METHOD BASED ON CELLULAR SIGNALLING DATA

1| Cellular Signaling Data

Number of trips OD Matrix derived from SIM cards movements.



2| Origin Destination (OD) Matrix

Distance OD Matrix derived using BingMaps Services.



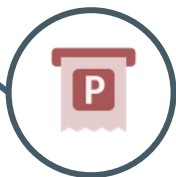
3| Correction: Driving Trips

Compute the proportion of people driving.



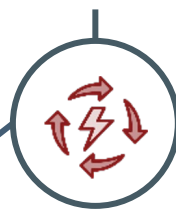
4| Correction: Private chargers

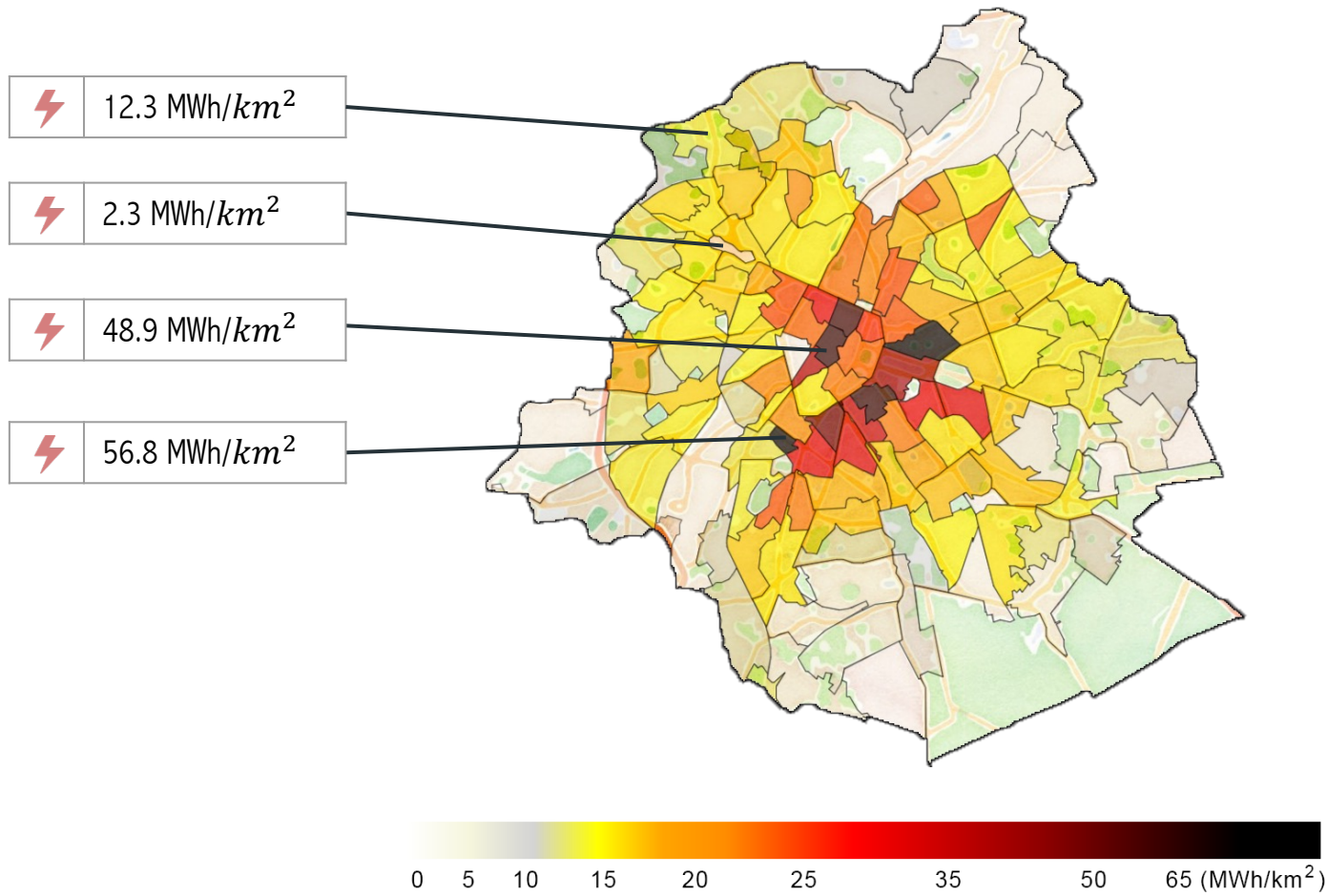
Compute the density of people having access to a private charger.



5| Energy OD Matrix

Convert the distances into EV consumption in kWh.





03 DEMAND SEGMENTATION

METHOD BASED ON THE CITY'S POINTS OF INTERESTS

1| Residential Segmentation

Compute the proportion of residential charging demand.

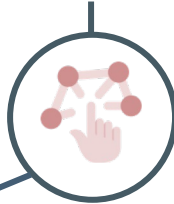


2| Non-Residential Segmentation

Segmentate the non residential demand using Points of Interests (POIs).



3| Association

Link each POI to a charging technology.





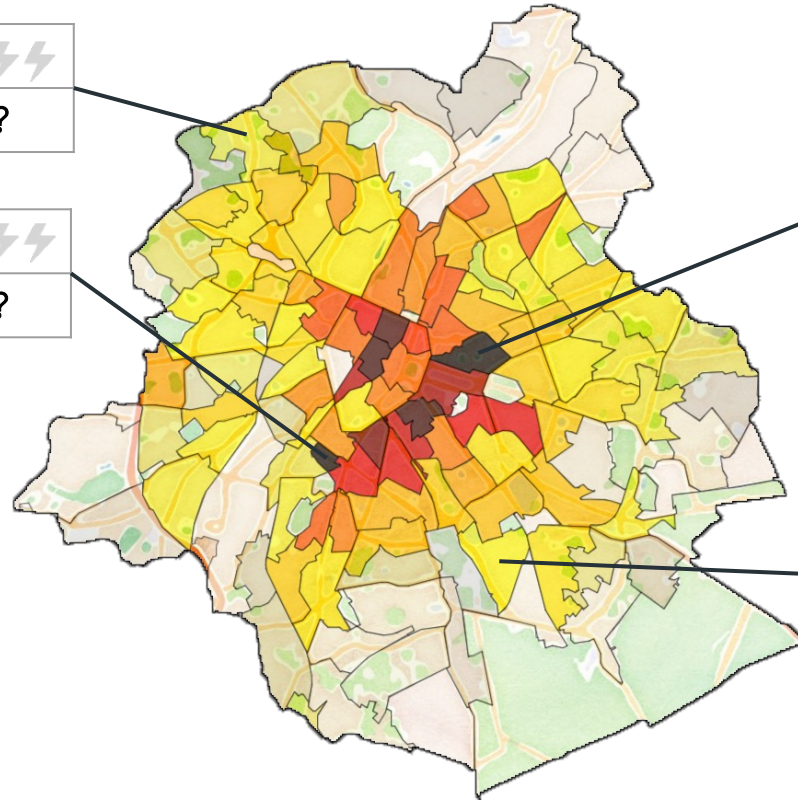
Residential Segmentation

A

	48 km	80%	⚡⚡⚡
	12 km	20%	?






B

	2 km	12%	⚡⚡⚡
	14 km	88%	?








Non-Residential Segmentation

C

	135	⚡⚡⚡
	17	⚡⚡⚡
	126	⚡⚡⚡
	265	⚡⚡⚡
	4	⚡⚡⚡

D

	6	⚡⚡⚡
	4	⚡⚡⚡
	14	⚡⚡⚡
	19	⚡⚡⚡
	0	⚡⚡⚡



Residential Streets



Non-Residential Streets



Office



Tourism



Shops



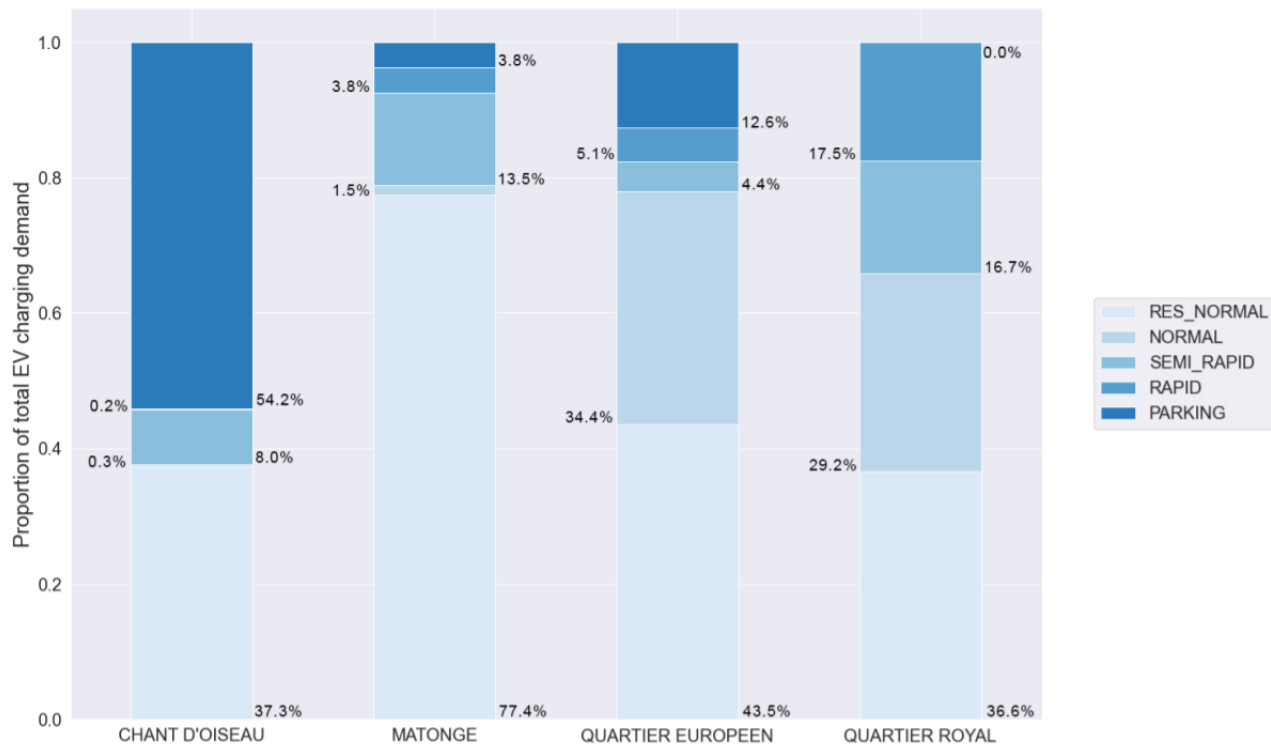
Cutlery



Health

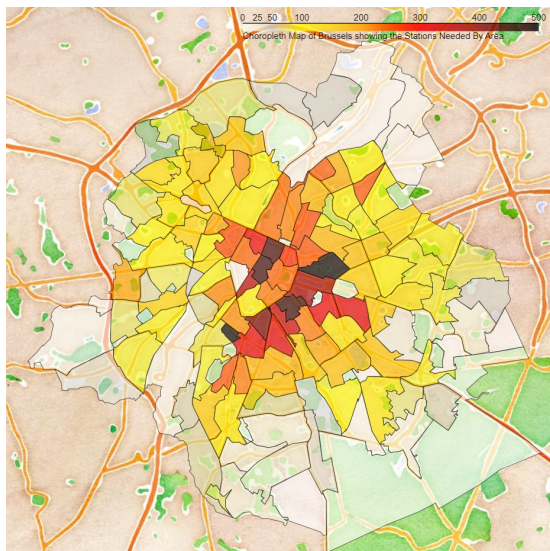
03 DEMAND SEGMENTATION

RESULTS

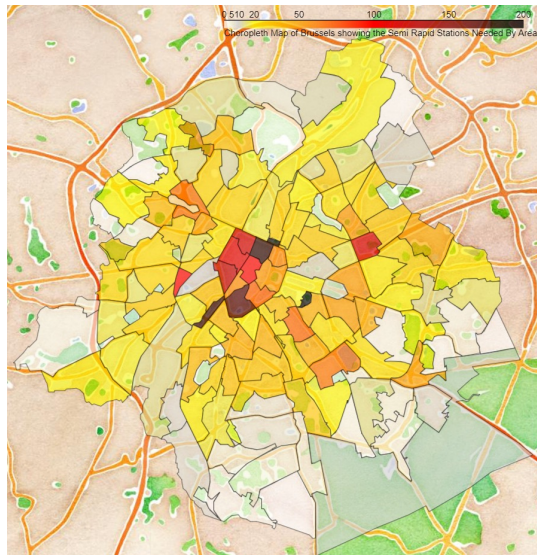


RESULTS

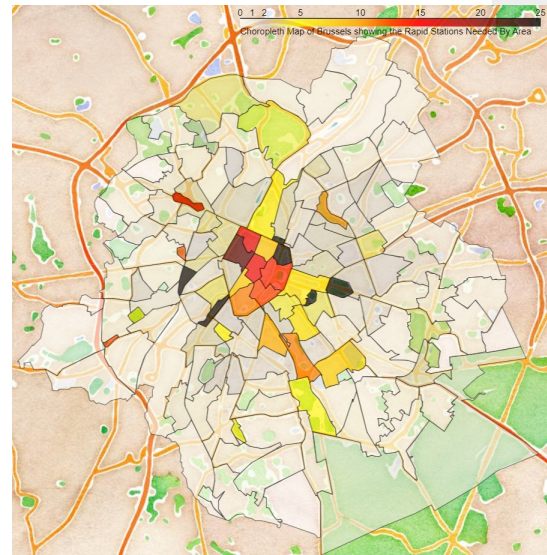
NUMBER OF STATIONS NEEDED



Number of **normal** charging stations divided by the area.



Number of **semi-rapid** charging stations divided by the area.



Number of **fast** charging stations divided by the area.

CONCLUSION

KEY TAKEAWAYS



Data-driven method providing actionable insights for city planning teams.



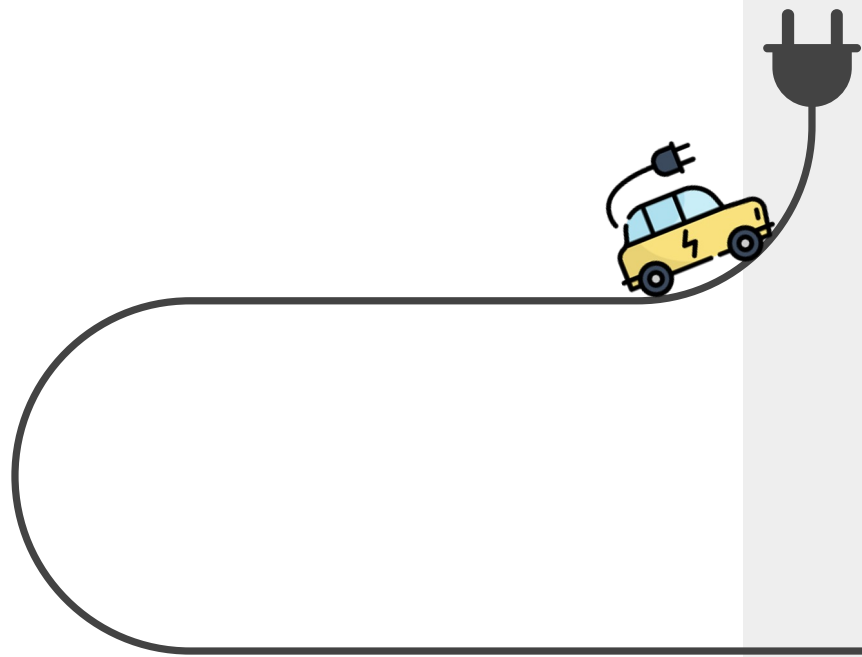
Charging demand segmentation methods are little covered by literature.



The methodology should be tailored to each city.



Methodology developed during my master thesis.



THANK YOU FOR YOUR ATTENTION

CONTACTS

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