



# **A Smart-card Based Analysis of During and Post-Disruption Impacts on Public Transport Passengers' Travel Pattern**

A case study of Stockholm, Sweden

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# Background

Most studies have only concentrated on analyzing impacts during disruption of **one or two modes** of travel in **multimodal Public Transport (PT)**

- **Liu et al. (2021)**

- passengers' behavior changes
- two modes: urban railway and bus bridging

- **Yap and Cats (2022)**

- ridership impacts
- one mode: trams in Amsterdam

- **Mo et al. (2022)**

- inferring passenger responses
- one mode: urban railway



# Introduction & Research Questions

This study **holistically examines the impacts of planned disruptions** on multimodal public transport passengers' travel patterns

- What is **the impact of planned PT disruptions** on Stockholm's multimodal network?
- What are the **alternative paths and presence of affected passengers** before, during, and after the disruption?
- Is there a **prolonged effect** of these disruptions on PT passengers?

# Case Study



Arkivbild. Foto: Lisa Mattisson (DN.se)

Pendeltåg		Track	
Commuter rail			
43 Sundbyberg Bålsta	06:26	×	Inställt
41 Solna Märsta	06:30	×	Inställt
43 Älvsjö Västerhaninge	06:36	×	Inställt
40 Solna Uppsala	06:38	×	Inställt
41 Älvsjö Södertälje C	06:39	×	Inställt
		12 min 1/2	
43X Sundbyberg Kallhäll	06:41	×	Inställt
43 Sundbyberg Kungsängen	06:44	×	Inställt
43X Älvsjö Nynäshamn			19 min 3/4
41 Älvsjö Södertälje C			22 min 3/4

Arkivbild. Johan Jeppsson / TT (nyteknik.se)

The drivers' strike in the commuter rail (Pendeltåg)  
between 17th - 19th April 2023

# Methodology (1/2)



GTFS-Real time  
GTFS  
AVL  
AFC

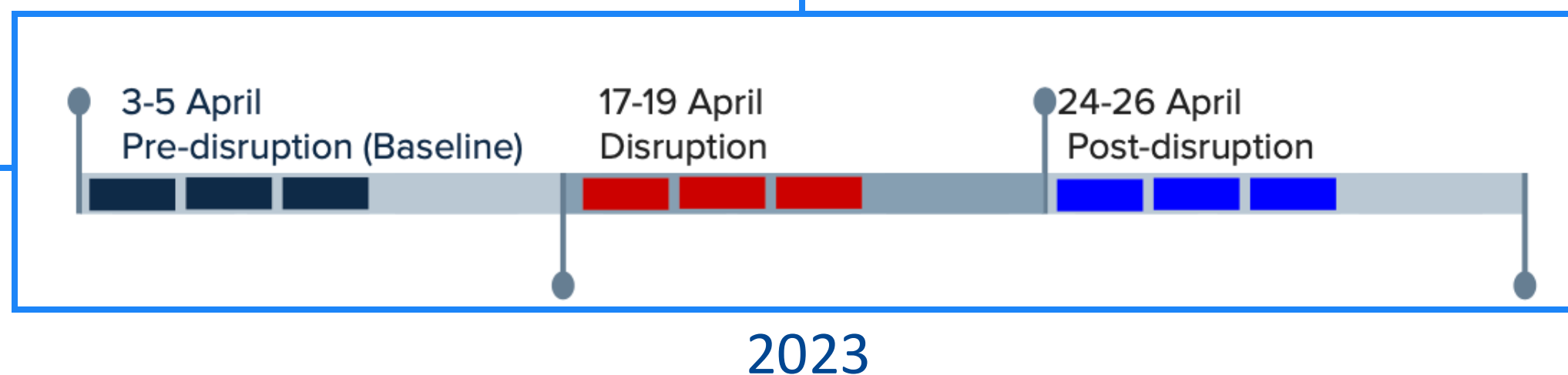
PT  
Network

## Aggregate Level

- System level
- Line level
- Station level
- Passenger onboard loads on segments

## Individual Level

- Commuter rail passenger onboard loads on segments across the network

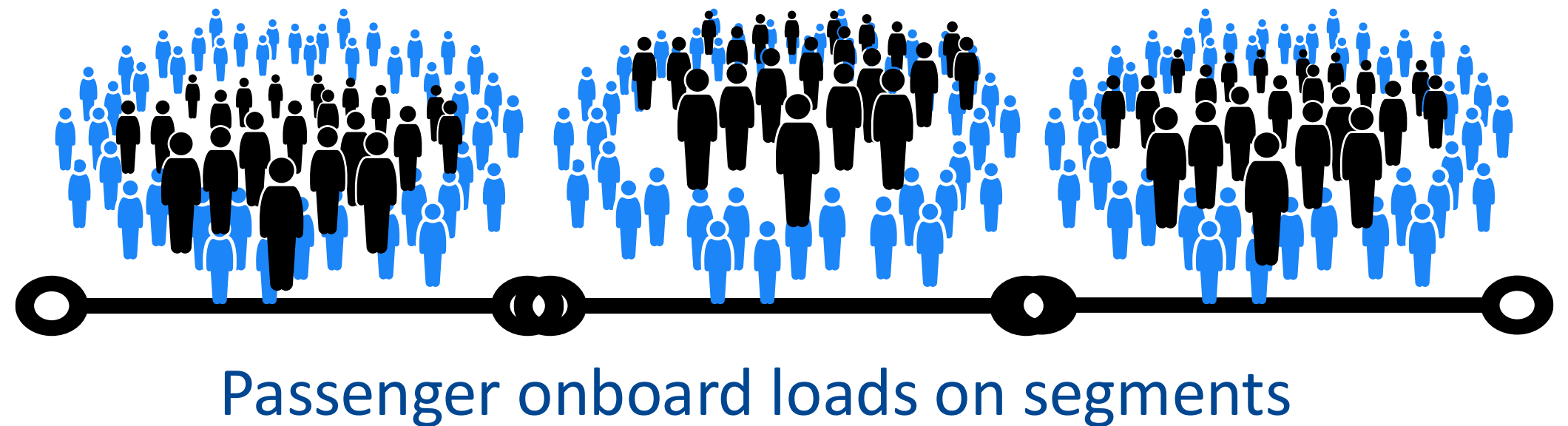




$$\Delta \bar{q}_a = \frac{\overline{q_a^{\text{during}}} - \overline{q_a^{\text{pre}}}}{\overline{q_a^{\text{pre}}}}, \quad \forall a \in \text{PT network}$$

## Aggregate Level

All passengers

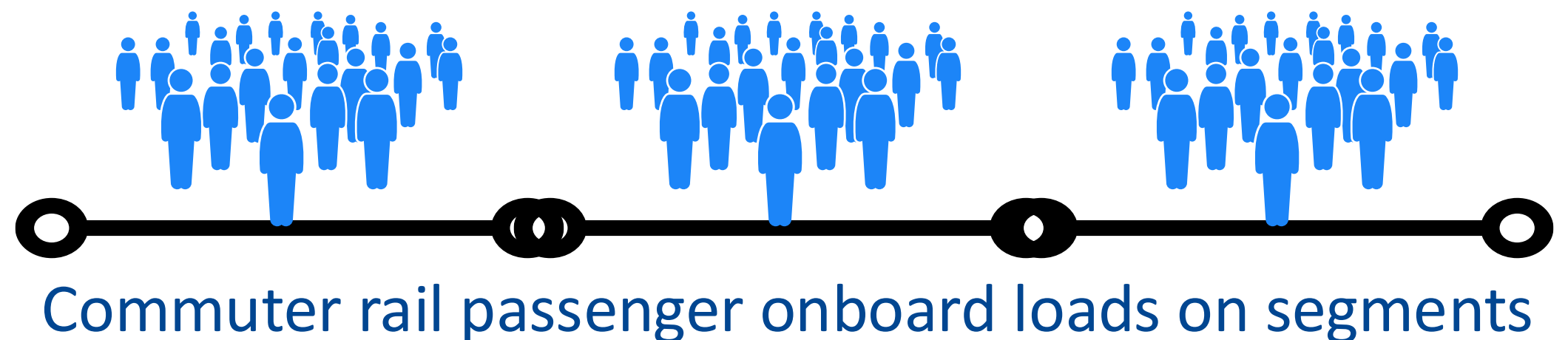


## Individual Level

> 5 and ≤ 300

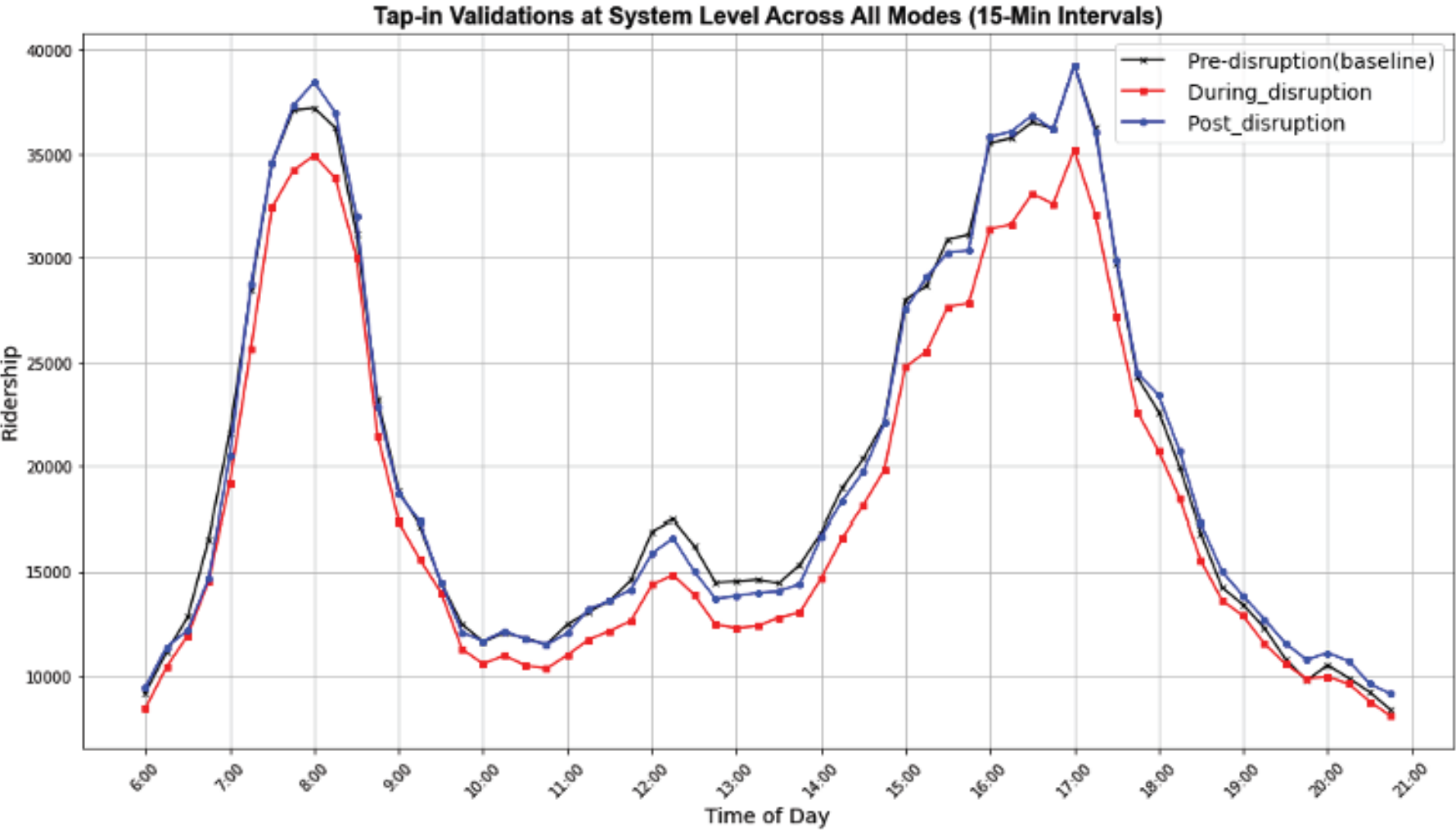
commuter rail passengers'

tap-in validations in April 2023



# Results and Discussions (1/6)

## System Level

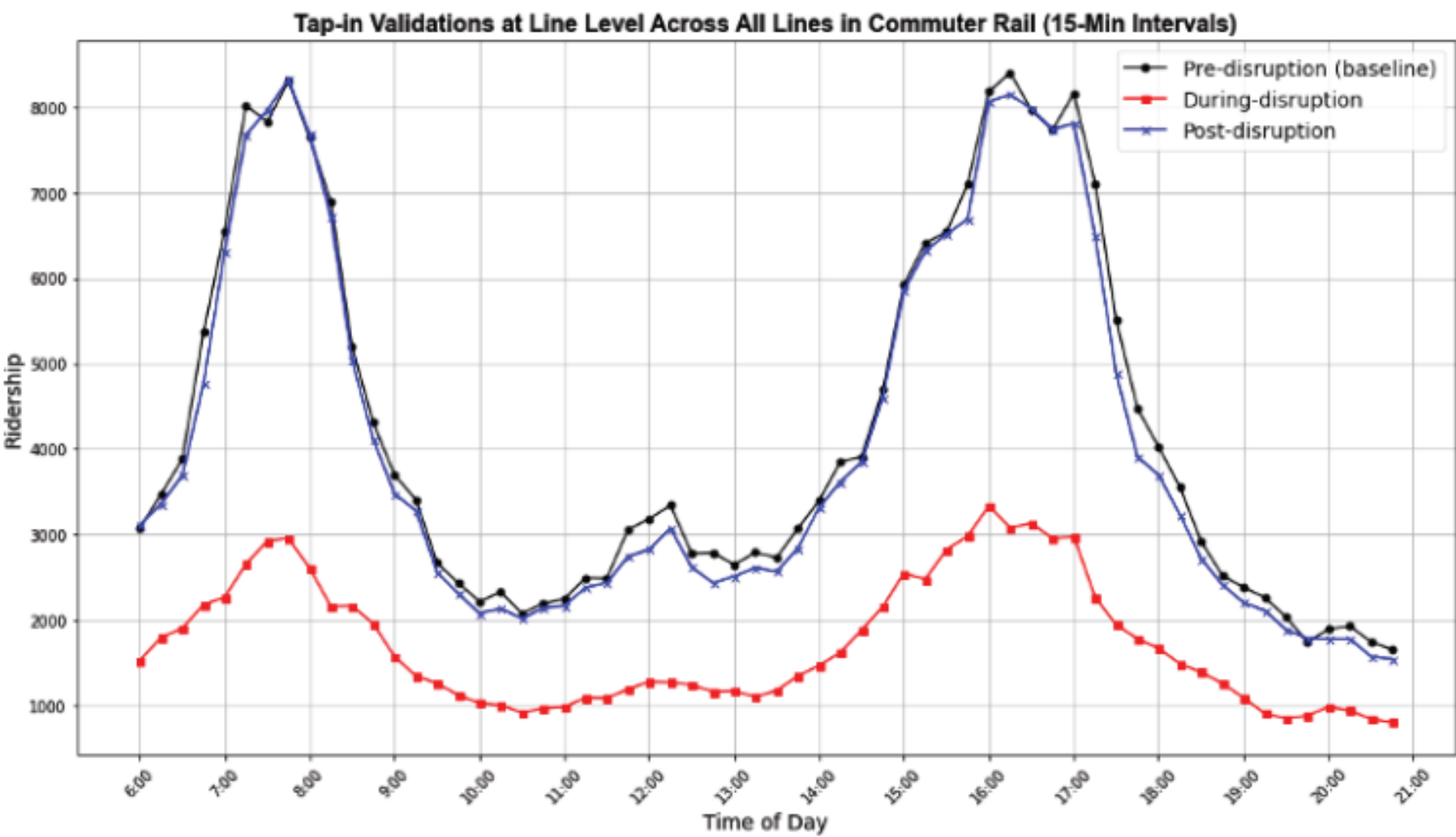


**Pre-disruption** : 1.2 million passengers

**During-disruption**: decrease 9 % (108,000)

(significant difference at 95% CI)

## Line Level



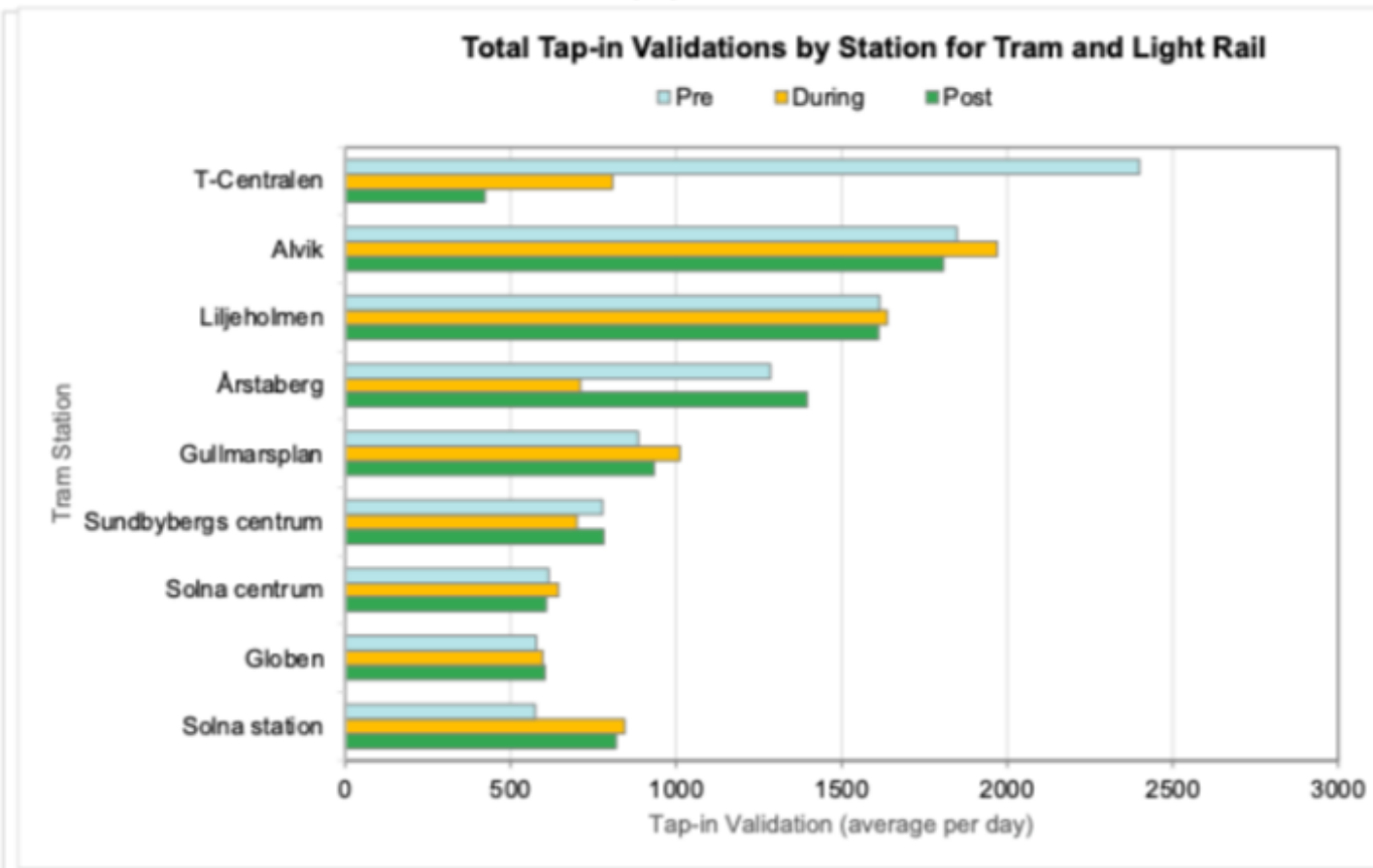
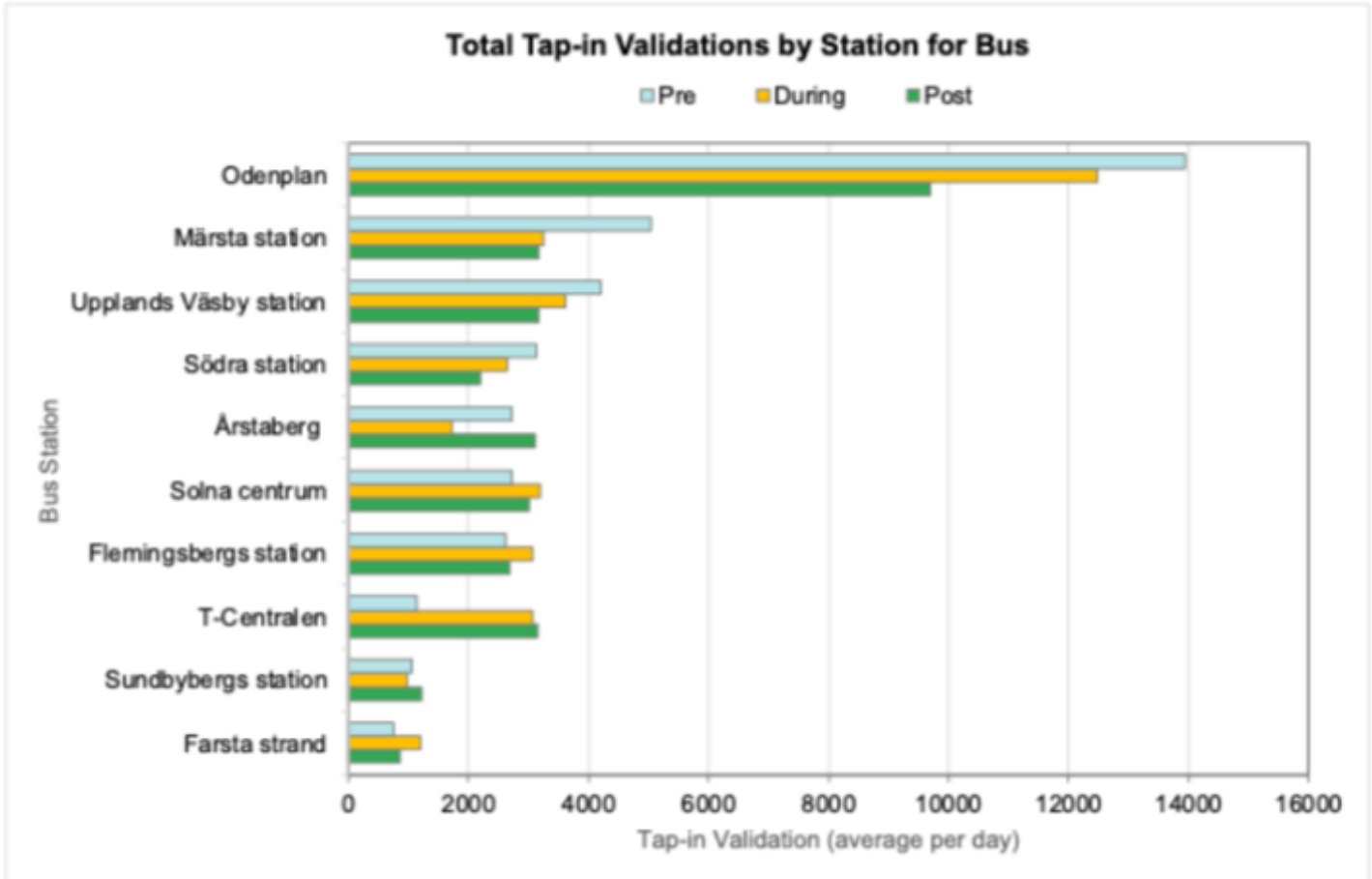
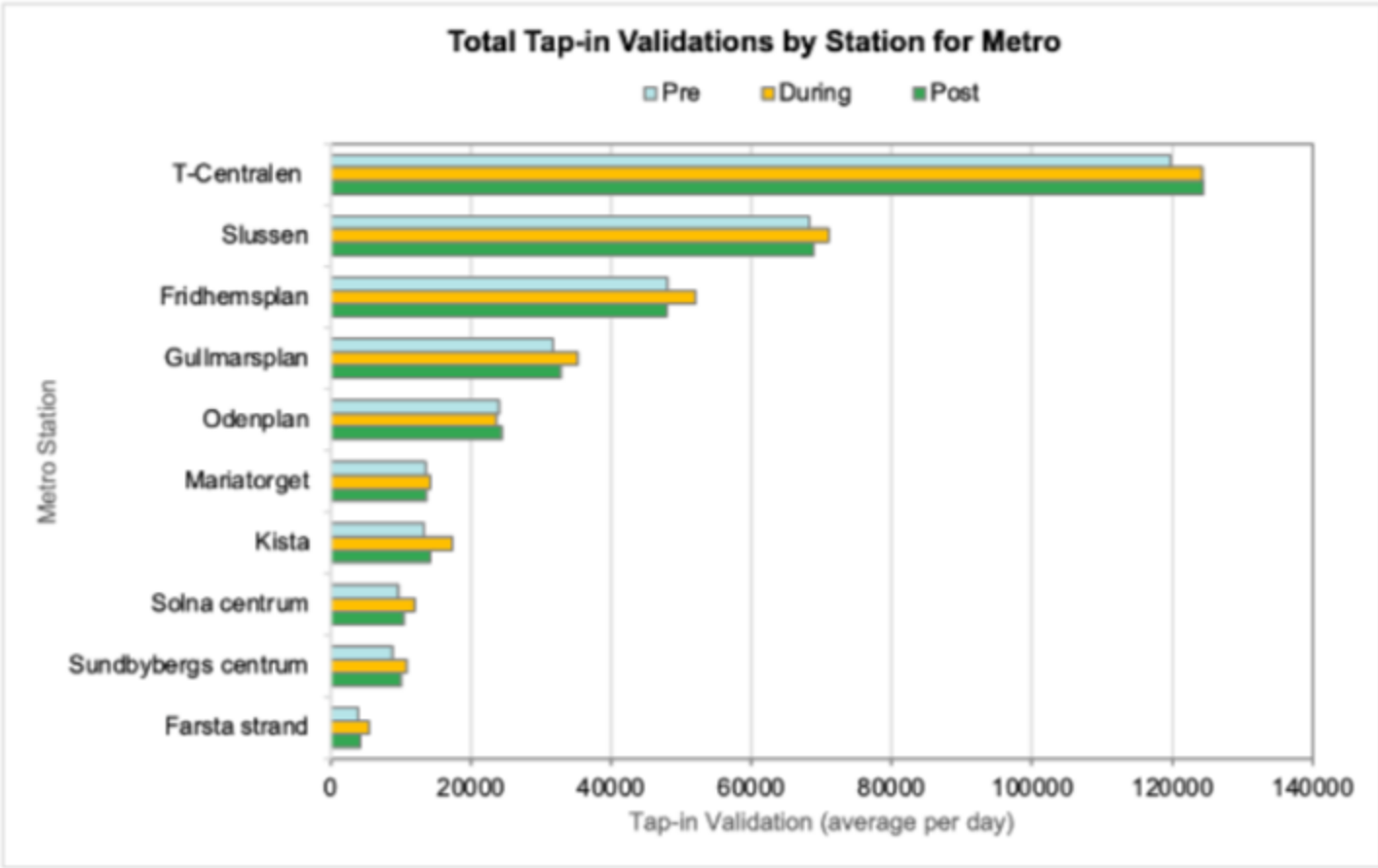
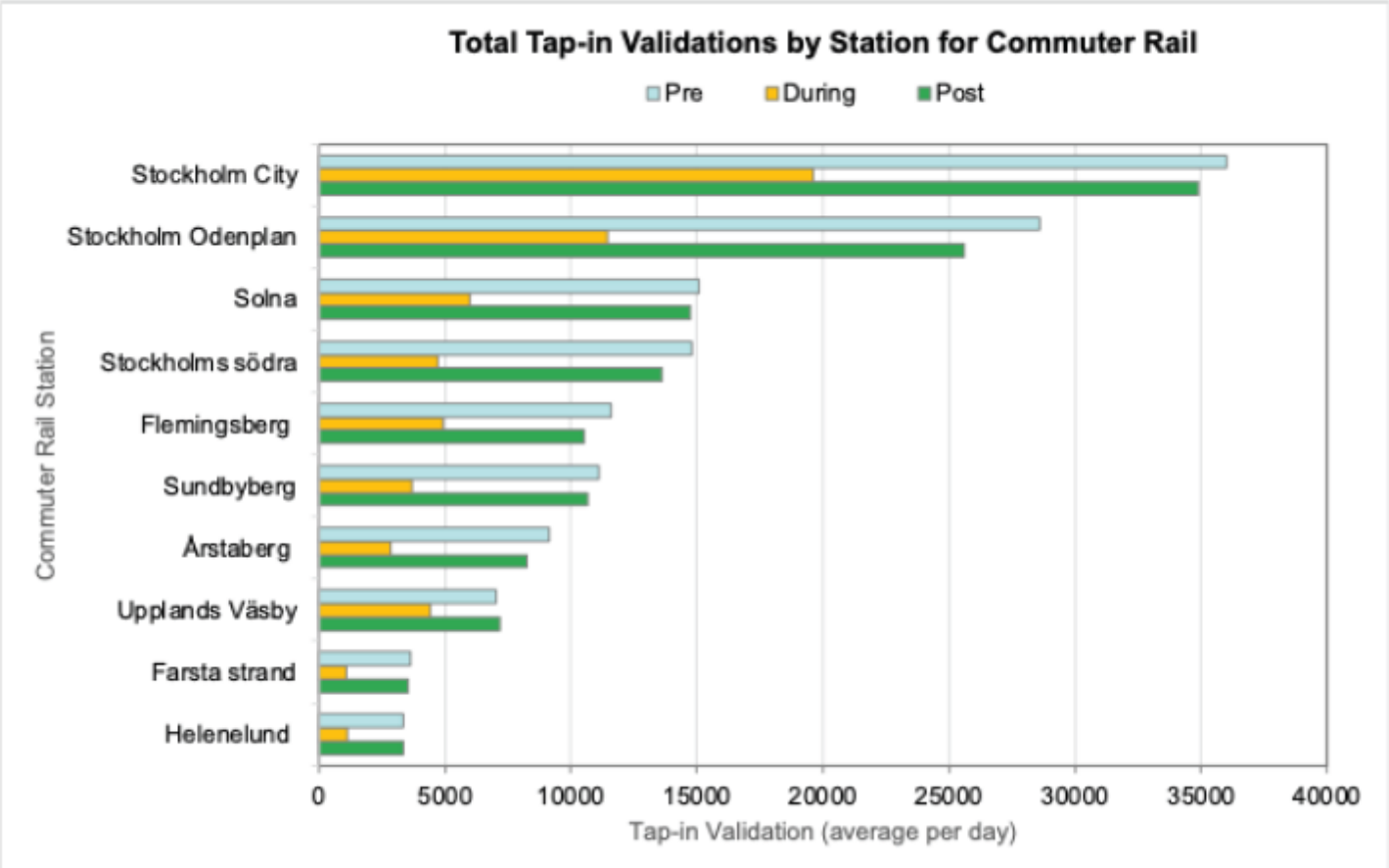
**Pre-disruption** : 250,000 passengers

**During-disruption**: decrease 60 % (150,000)

(significant difference at 95% CI)

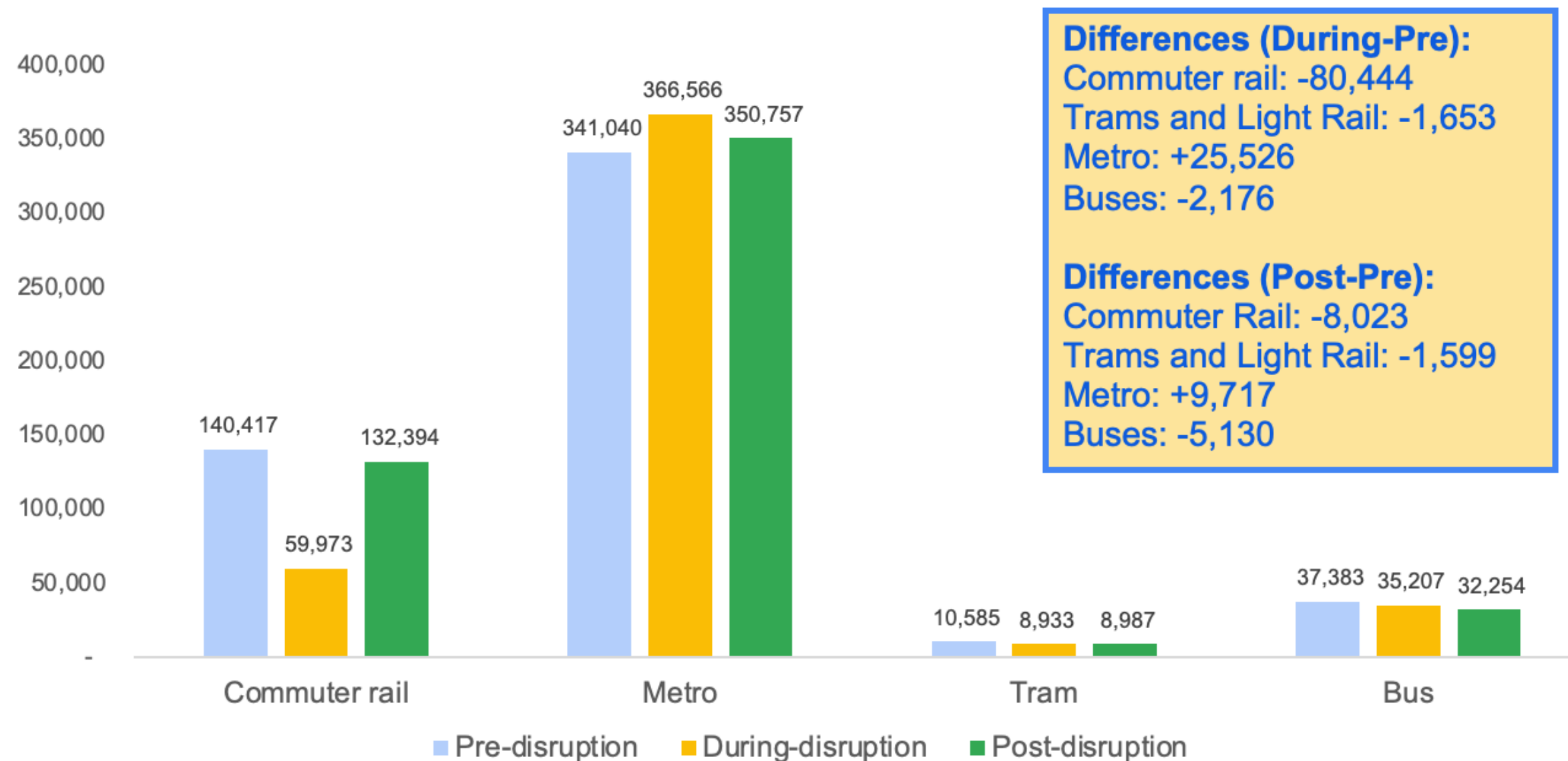


# Results and Discussions (2/6)



# Results and Discussions (3/6)

**Total Ridership by Mode**  
(average tap-in validation at all key stations)



About 25,000 trips  
gained in the metro

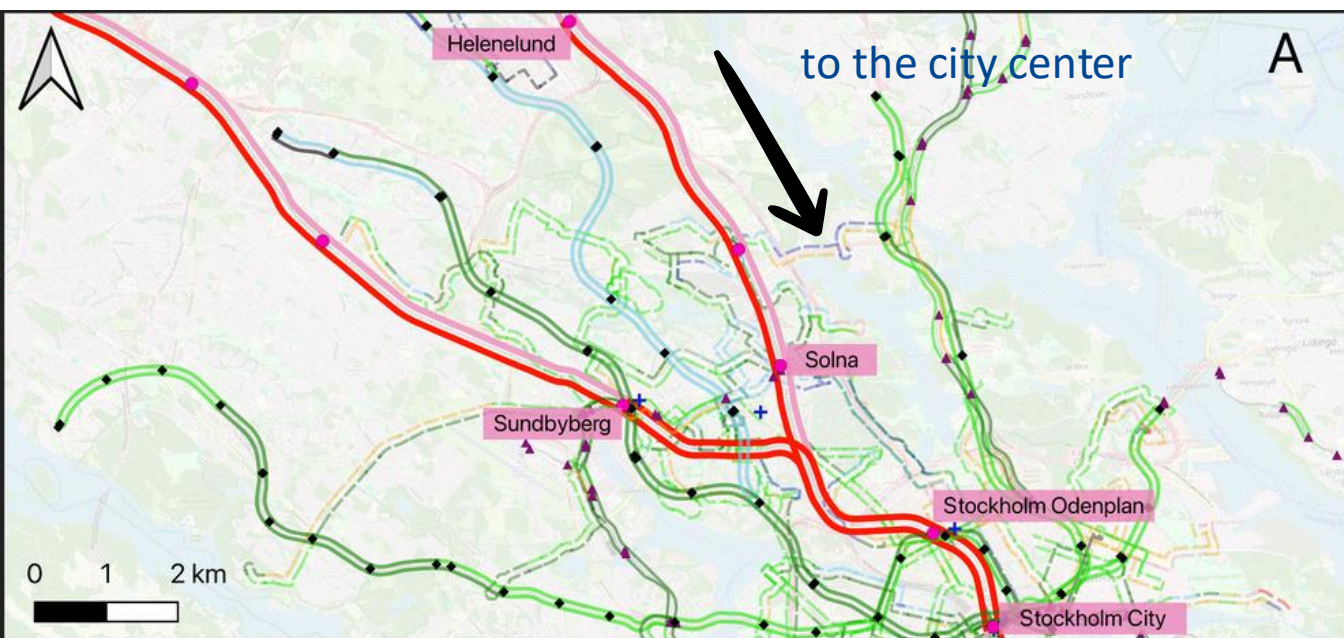
That number does not offset  
the total lost from  
commuter rail,  
tram and bus.

diff= 60,000 trips

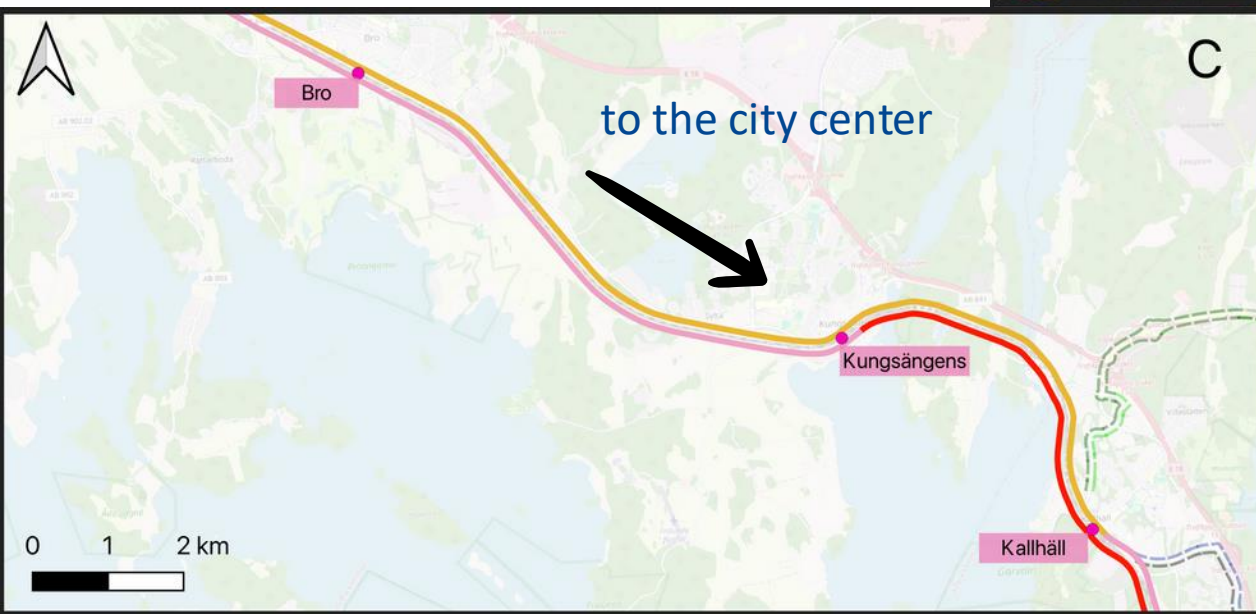
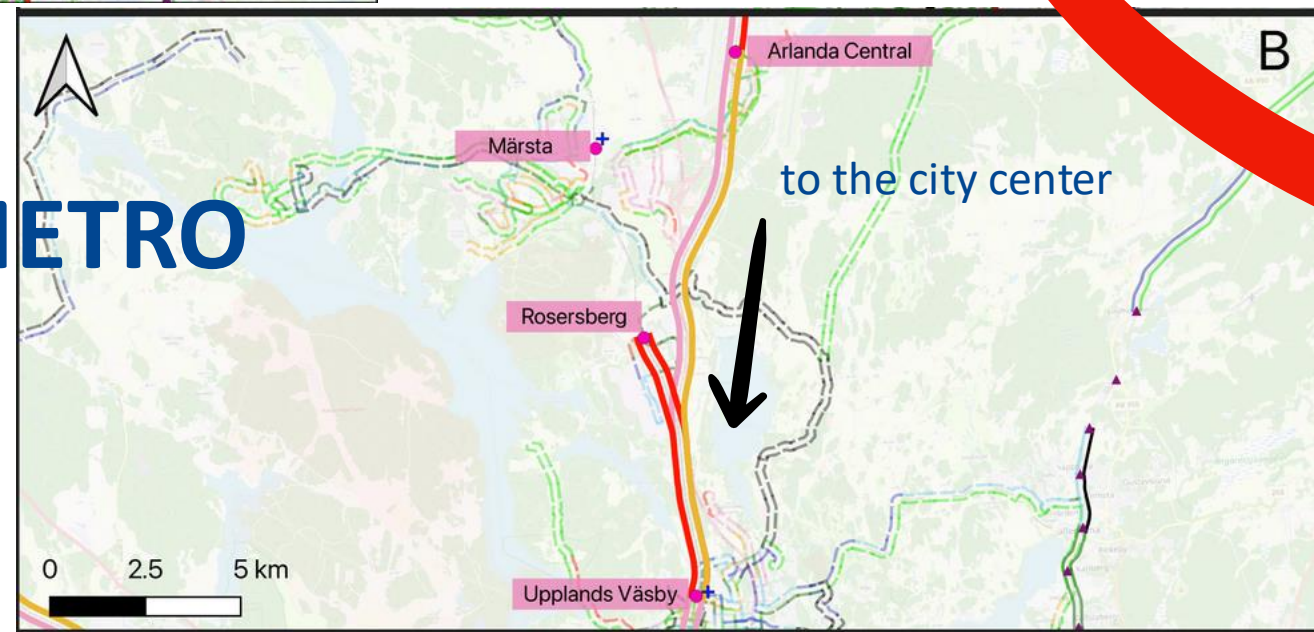
The disruption resulted in network-wide impacts beyond the affected area



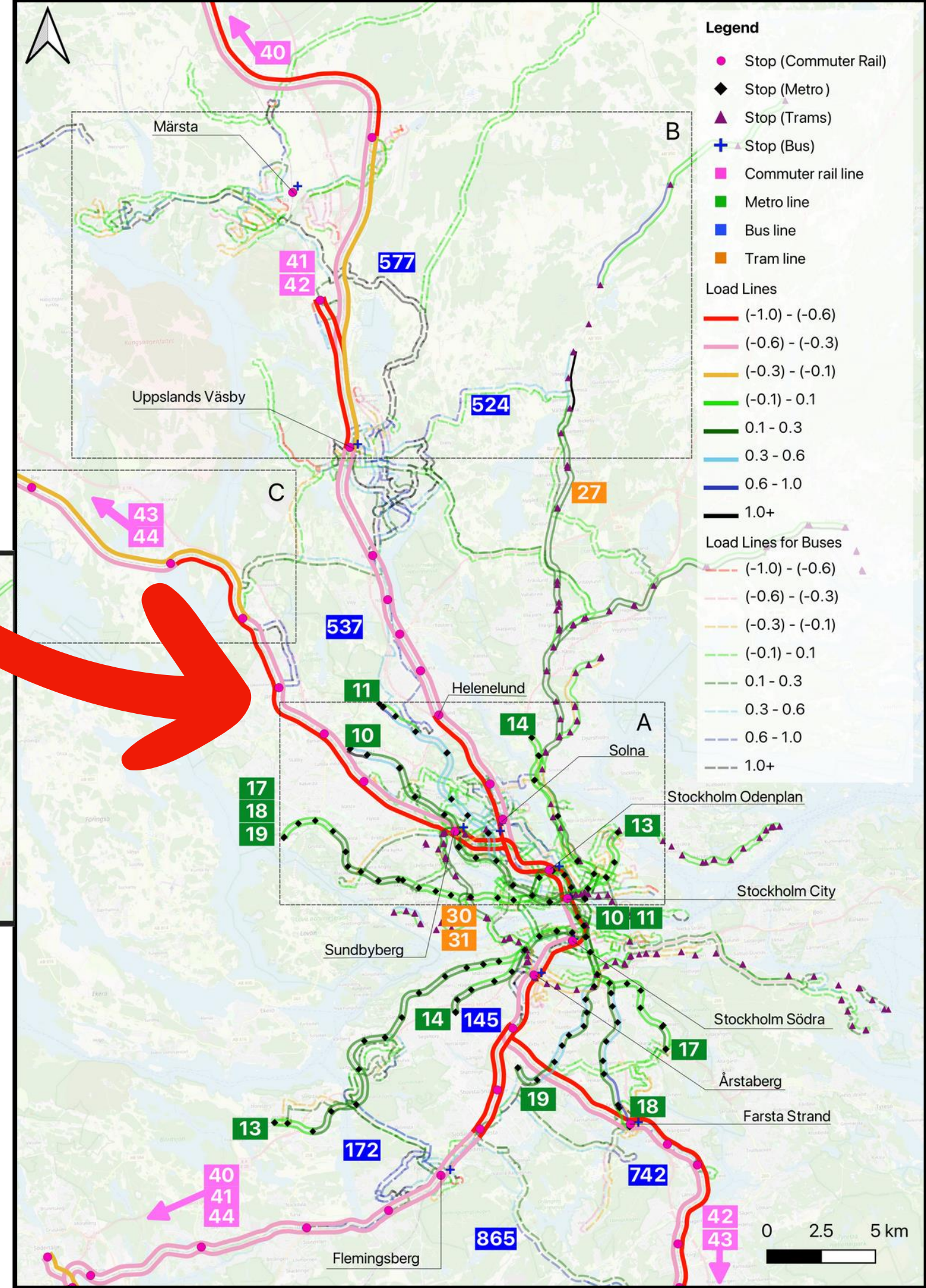
# Results and Discussions (4/6)



**METRO**



decrease 60-100%

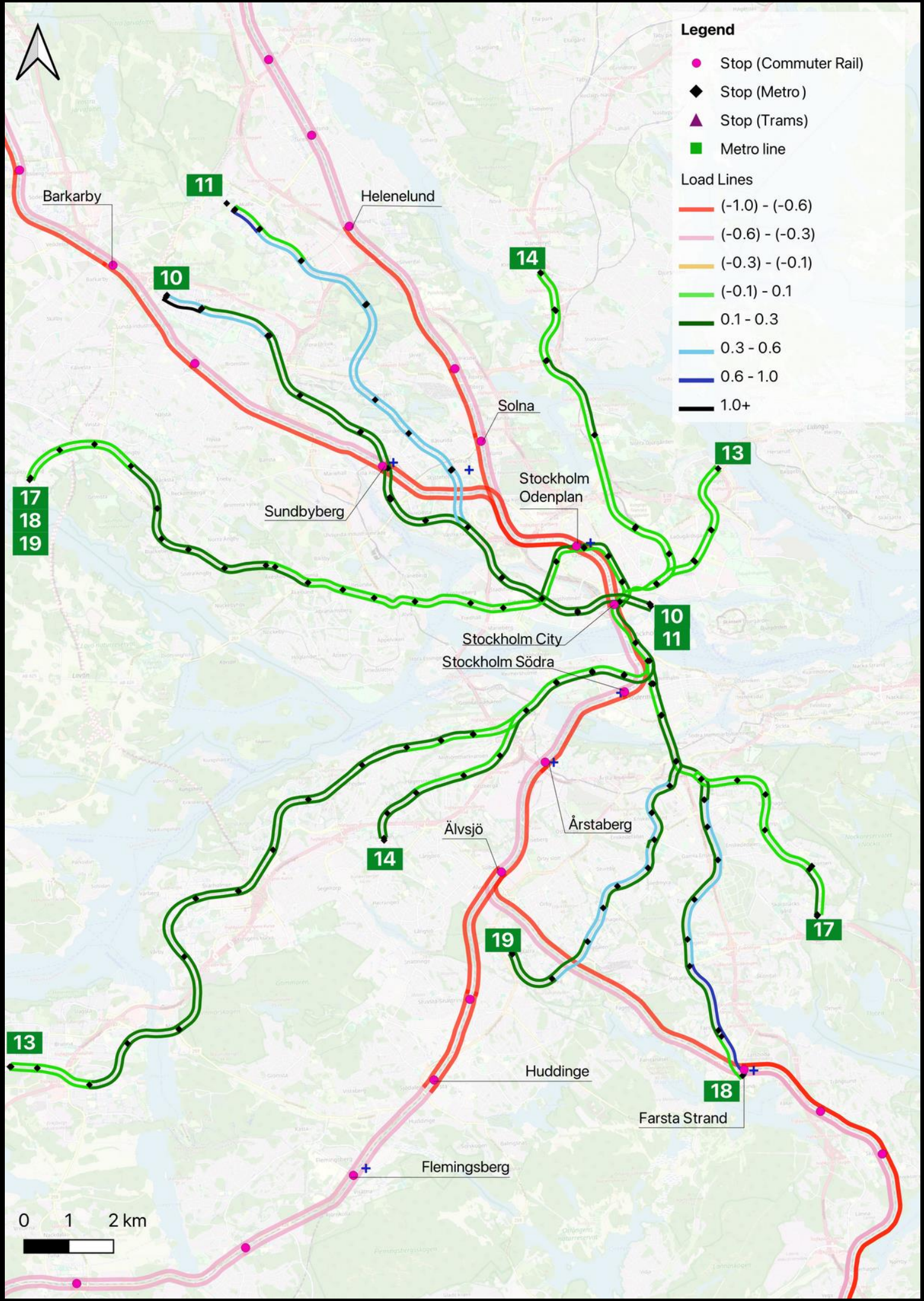






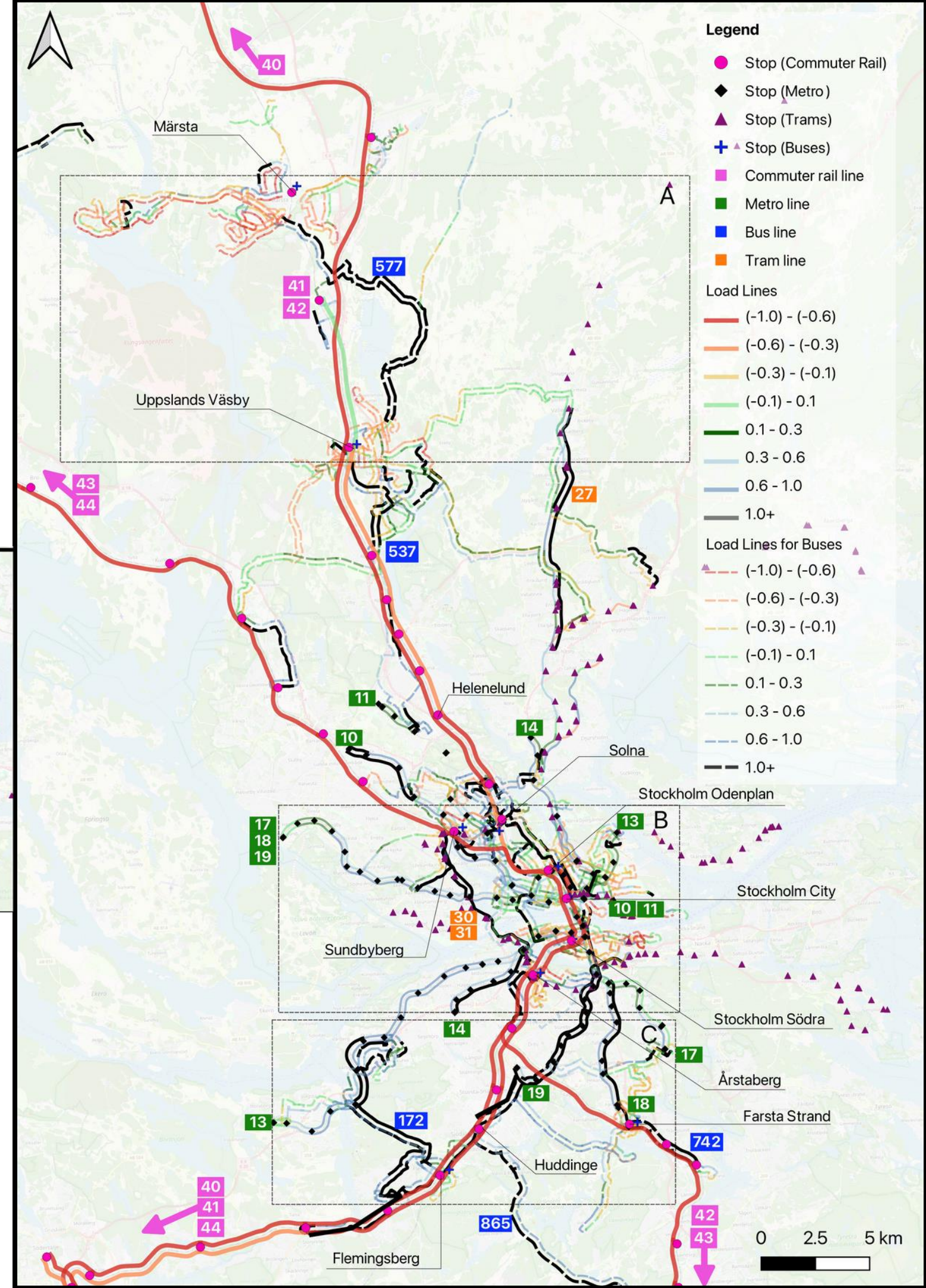
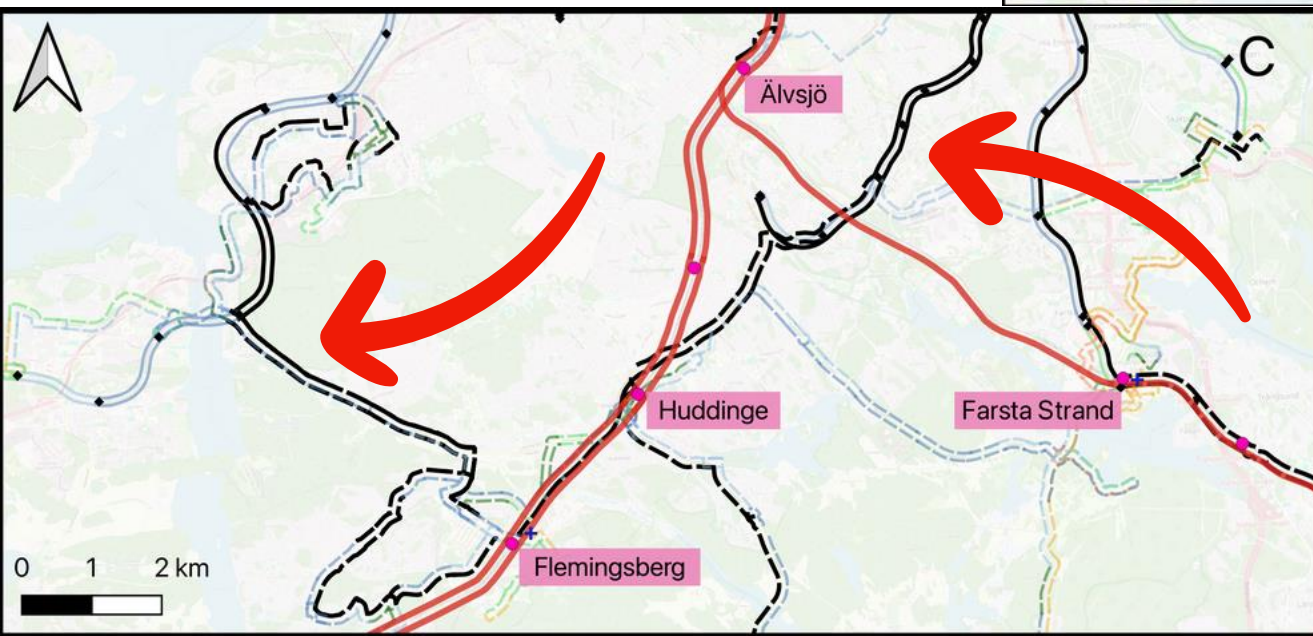
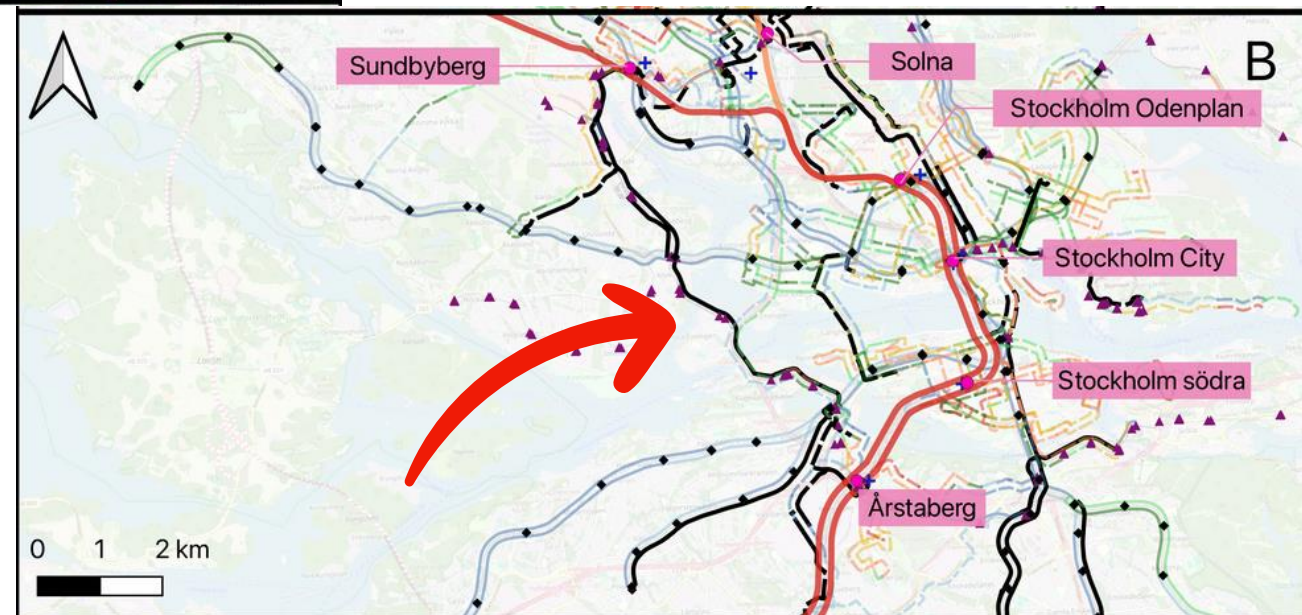
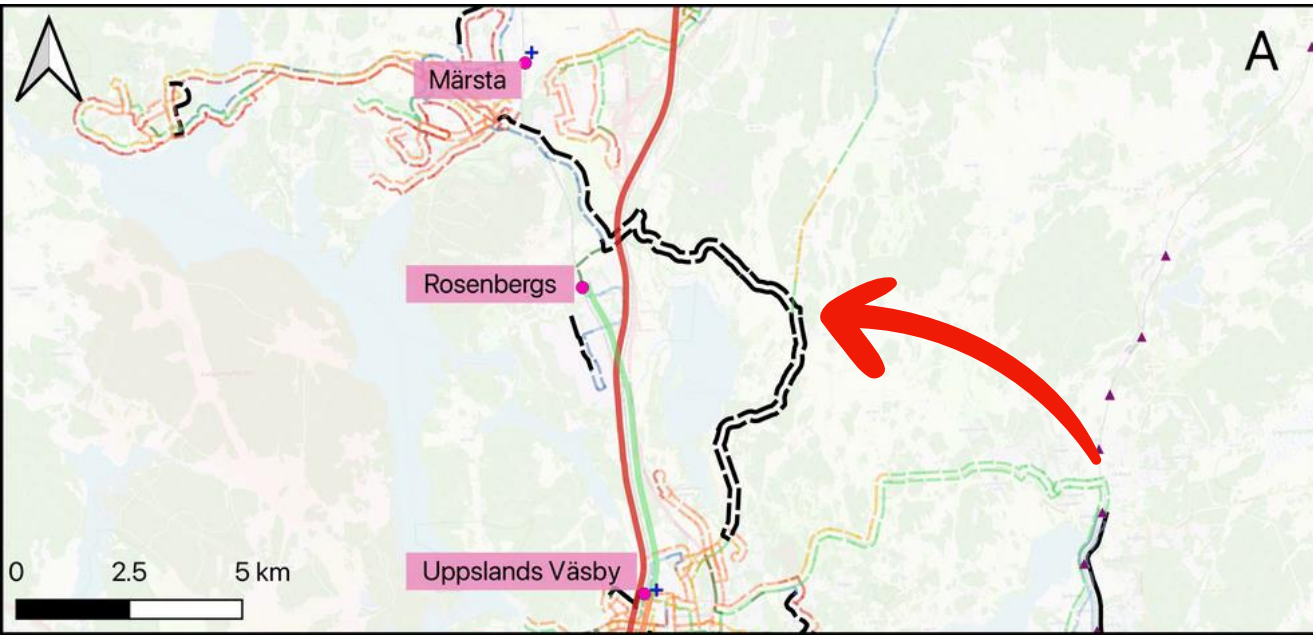
# Results and Disc

## METRO





# Results and Discussions (6/6)







# Limitations and Future Work

- Ticketing machines
- The nature of ticket validation practices in the tram system
- **Identify passengers** that decided not to travel during the disruption
- Applying factors, such as demographics, and ticket types to **identify the most effected passenger groups**
  - Applying an econometric method to **assess losses**
- Incorporate **risk-based resilience management**, such as passenger adaptability





# Contributions

- Helps traffic planners and operators to **anticipate the impacts** of disruptions to **improve disruption management strategies**
- **Highlights affected areas** that are vulnerable to disruptive events in the network
- **Identifies alternative paths (passengers' travel patterns)**
- **Addresses a real challenge** in PT systems and **identifies losses** in ridership and demand during disruption

# Thank you

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