



Aalto-yliopisto  
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# Optimal handover locations for two-echelon routing (presentation of results)

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Työn saa tallentaa ja julkistaa Aalto-yliopiston avoimilla verkkosivuilla. Muilta osin kaikki oikeudet pidätetään.



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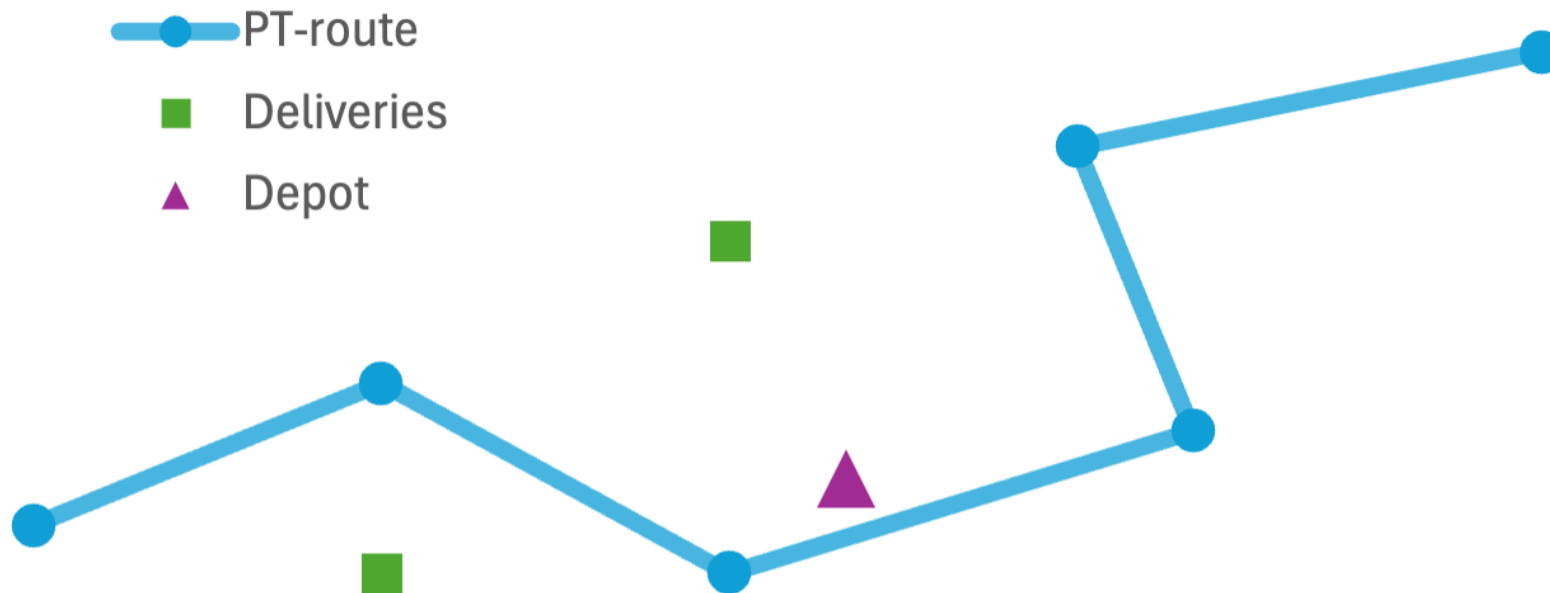


# Background

- Need for last mile logistics is rising
- Public transport already exists in metropolitan areas
  - Travels near delivery locations (homes)
- PT-vehicles often have extra space

→ Utilizing PT for package delivery a possible solution

# Model

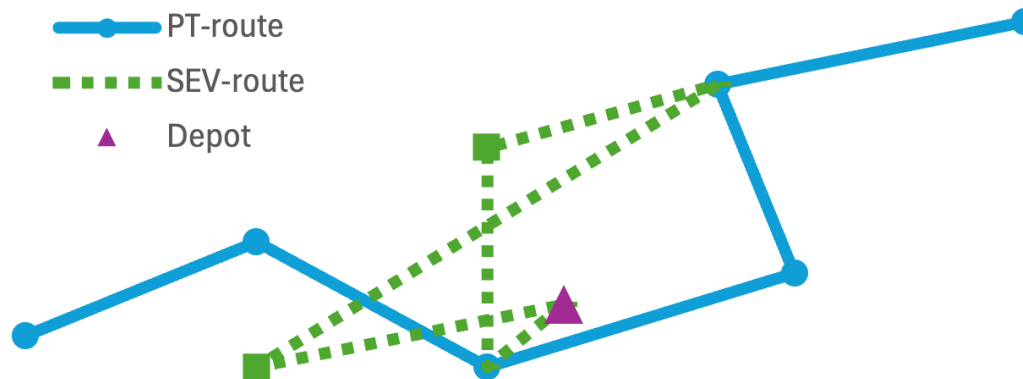


# Model



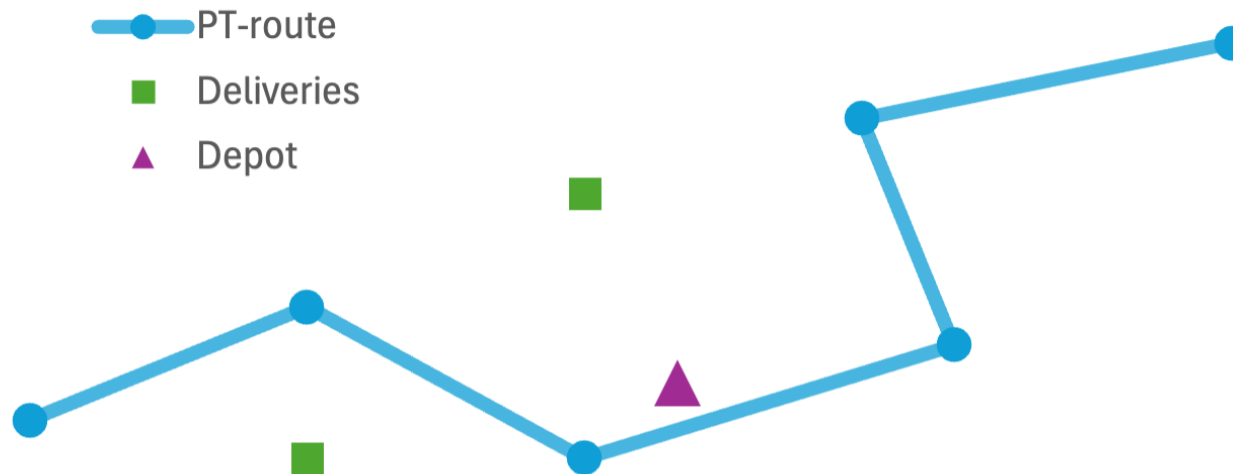
# Assumptions and constraints

- Single second echelon vehicle with capacity of 1
- All packages have same demand and all need to be delivered
- SEV and PT need to be synchronized
- Handover takes some additional time
- PT can catch up to schedule between stops



# Objective (1/2)

- Find which stops to use as handovers
- Minimize delay for people using public transport



## Objective (2/2)

- Objective function:

$$\sum_{s \in S} p(s) \cdot l_s$$

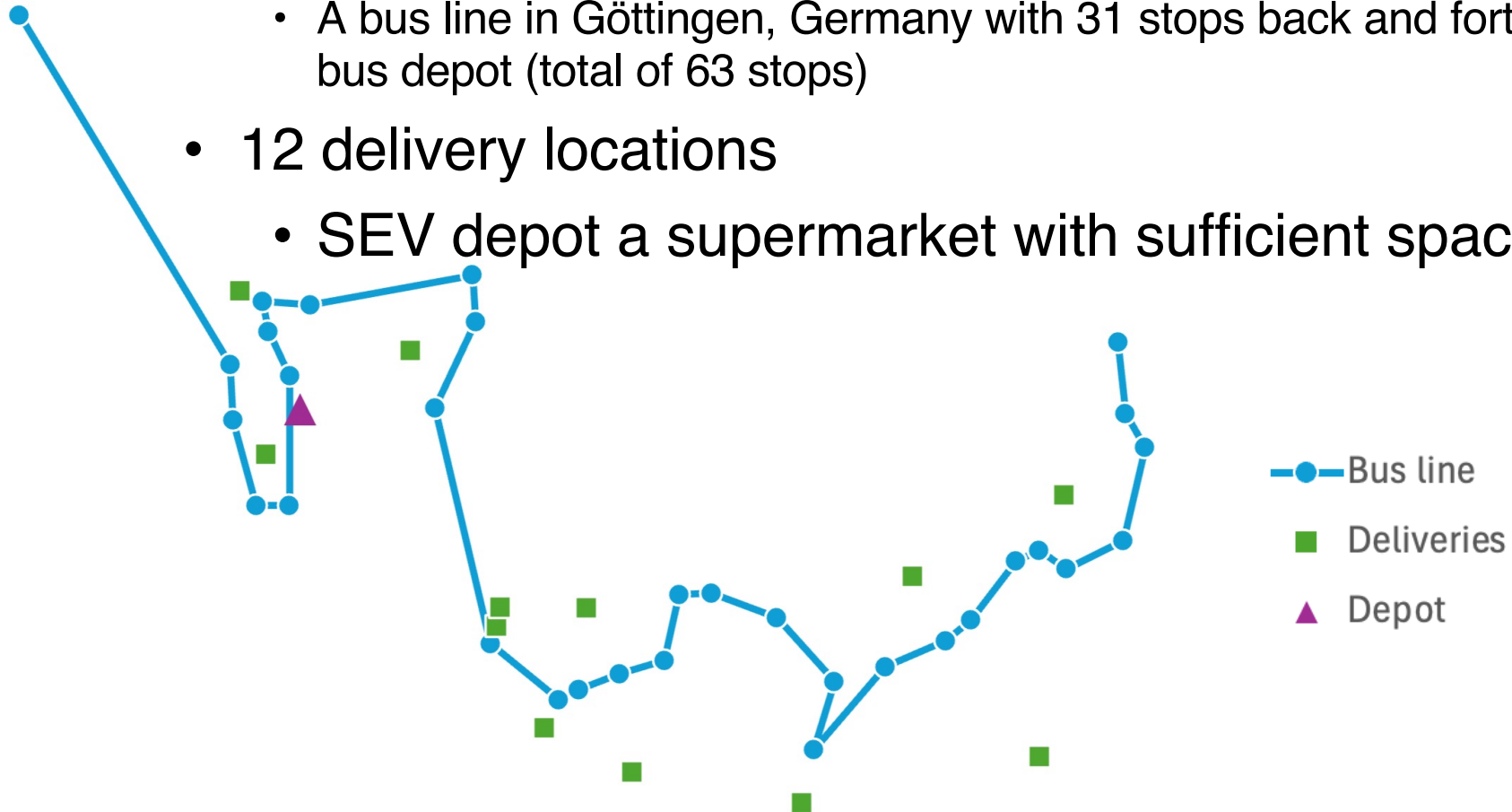
where  $l_s = a_{s-1} + w_{s-1} + t_{PT}(s-1, s) - t_{SCH}(s)$

and  $a_{s-1}$  models what time PT arrived at previous stop or later of two vehicles in case of handover

- Takes care of synchronization

# Data

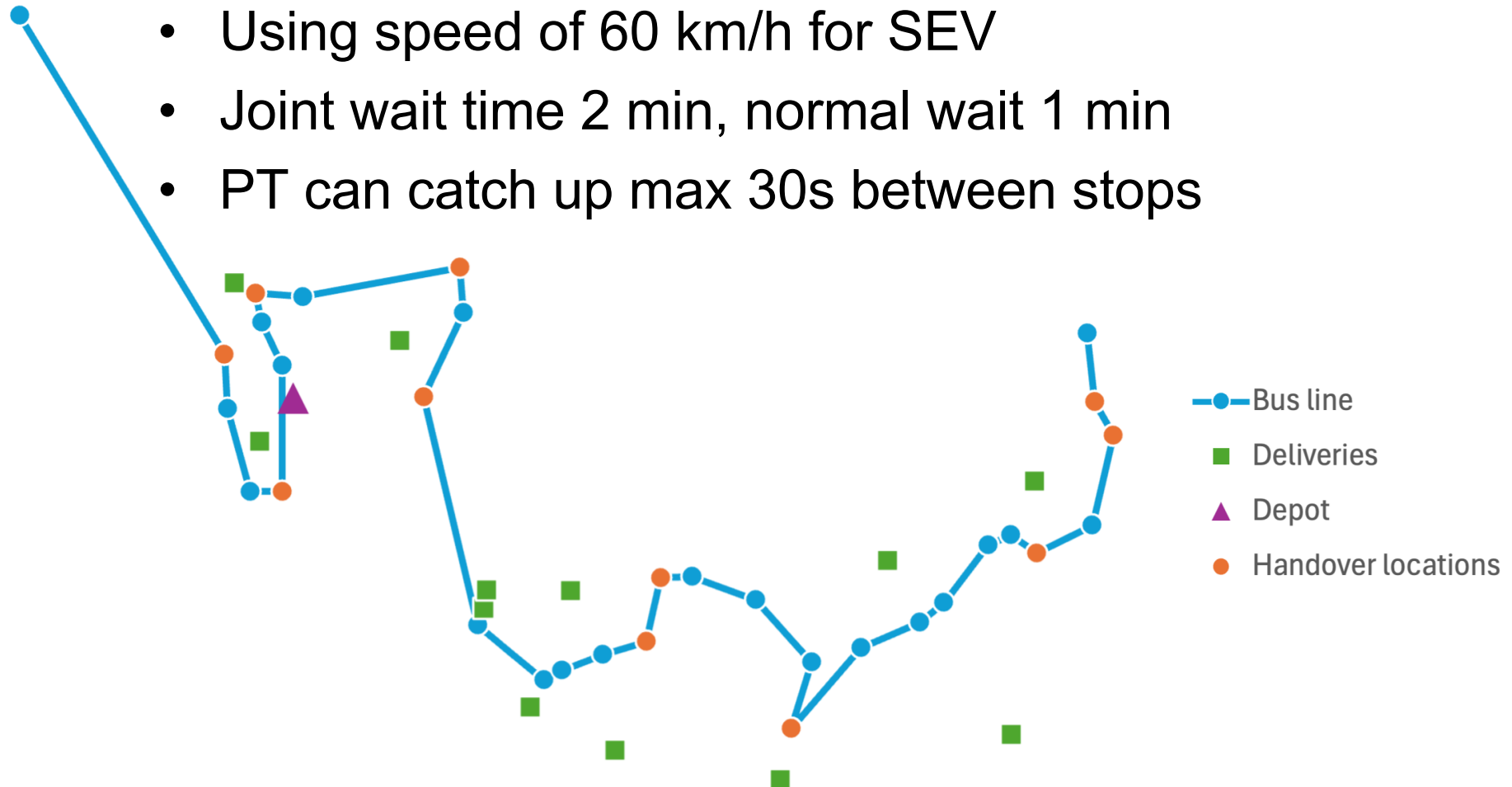
- Line 115 in data set *goevb* from LinTim
  - A bus line in Göttingen, Germany with 31 stops back and forth + bus depot (total of 63 stops)
- 12 delivery locations
  - SEV depot a supermarket with sufficient space





# Results

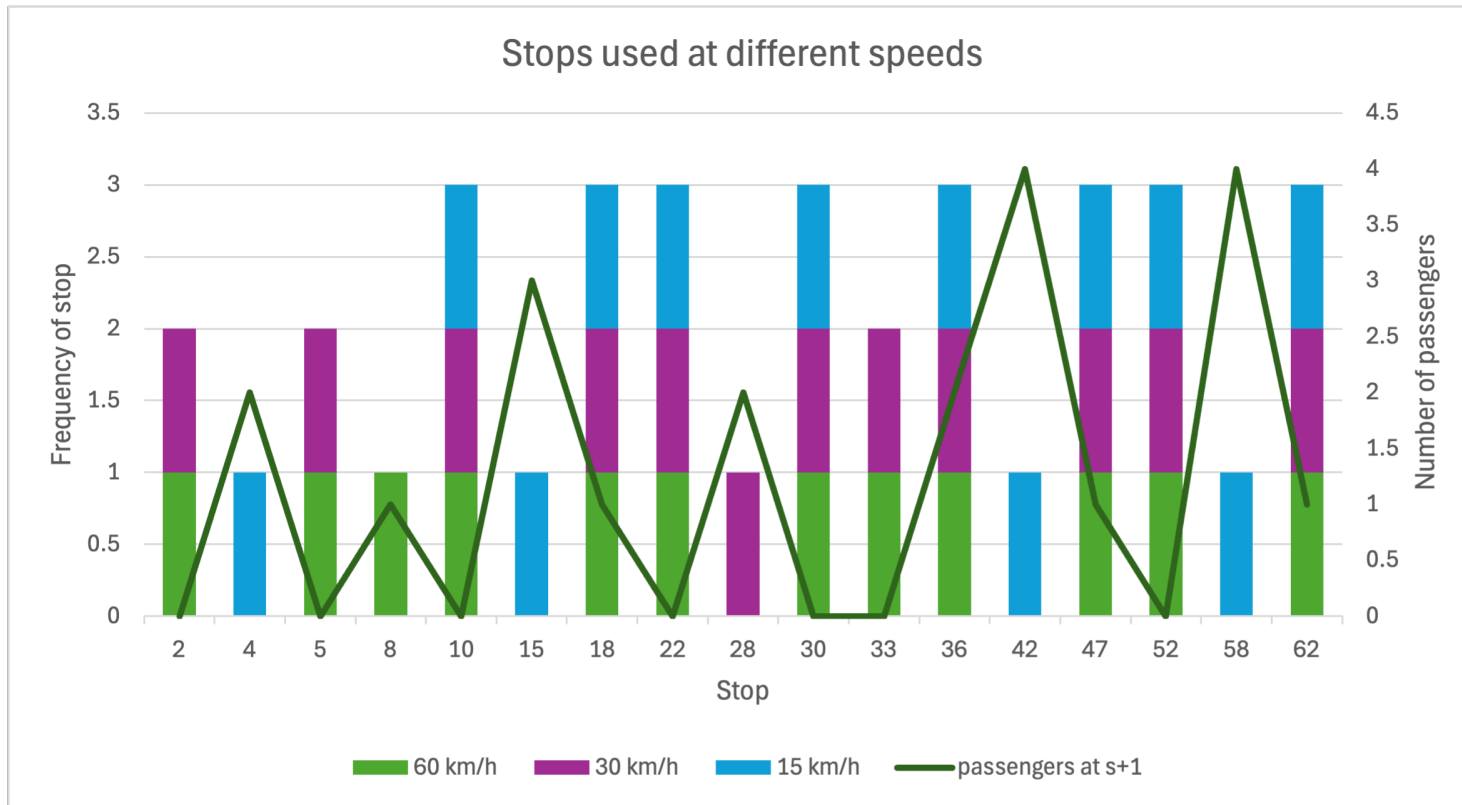
- Using speed of 60 km/h for SEV
- Joint wait time 2 min, normal wait 1 min
- PT can catch up max 30s between stops



# Results of stops with a delay

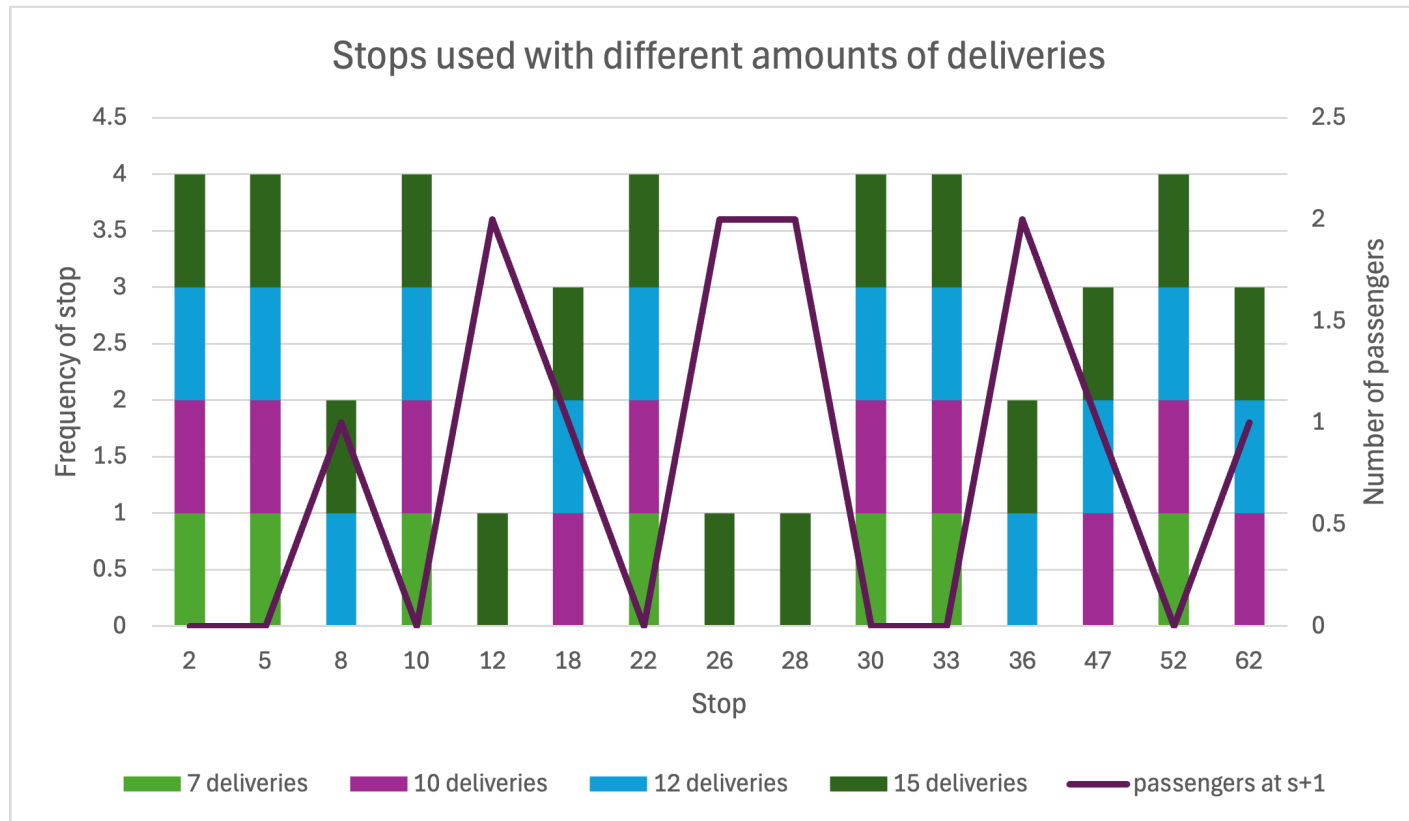
Stop	Handover before	Lateness	Passengers exiting	Cost
3	1	0.5	0	0
6	1	0.5	0	0
9	1	0.5	1	0.5
11	1	0.5	0	0
19	1	0.5	1	0.5
23	1	0.5	0	0
31	1	0.5	0	0
34	1	0.5	0	0
37	1	0.5	2	1
48	1	0.5	1	0.5
53	1	0.5	0	0
63	1	0.5	1	0.5
<b>TOTAL</b>	<b>12</b>	<b>6.0</b>	<b>5</b>	<b>3.0</b>

# Changing speed



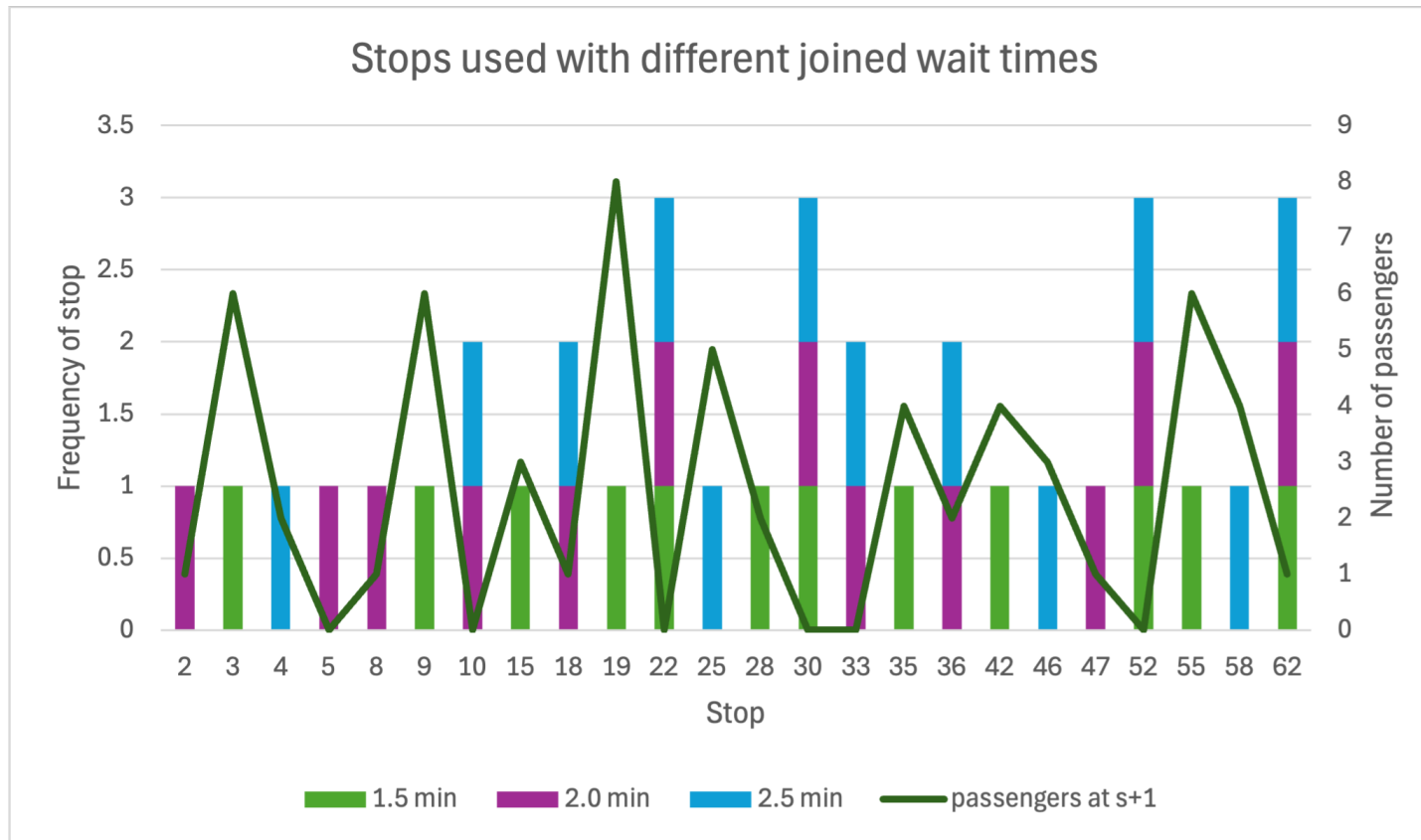
Speed of SEV	15 km/h	30 km/h	60 km/h
Obj.	9	3.5	3

# Changing amount of deliveries



Number of stops	7	10	12	15
Obj.	0	1.5	3	6

# Changing joined wait time



Joined wait time	1.5 min	2.0 min	2.5 min
Obj.	0	3	42

# Conclusions

- Finds very reasonable results even with many deliveries and entire bus line
- Struggles with slower speeds (could not solve with 10 km/h in reasonable time)
- Ideas for future research:
  - Having a larger capacity and/or more second echelon vehicles
  - Taking into account differences of time to catch up between stops
  - Taking into account real time information

# References

- Schiewe, P., Stinzendörfer, M. (2024). The combined second-echelon vehicle routing problem – Integrating last-mile deliveries into public transport
- Sluijk, N., Florio, A.M., Kinable, J., Dellaert, N., Van Woensel, T. (2023). Two-echelon vehicle routing problems: A literature review, *European journal of Operational Research*, 304(3), 865-886
- Azcuy, I., Agatz, N., Giesen, R. (2021). Designing integrated urban delivery systems using public transport, *Transportation Research Part E: Logistics and Transportation Review*, 156, 102525
- Data:
  - Stinzendörfer, M., Schiewe, P. (2024). Supplementary material for publication “The combined second echelon routing problem – Models and complexity.  
DOI: 10.5281 / zenodo.13235280. URL: <https://doi.org/10.5281/zenodo.13235280>

# MIP-formulation

$$\min \sum_{s \in S} p(s) \cdot l_s \quad (1a)$$

$$\text{s.t.} \quad x_{i,j} = 0, \quad i, j \in D, \quad (1b)$$

$$\sum_{s \in S} x_{DEP0,s} = 1, \quad (1c)$$

$$\sum_{d \in D} x_{d,DEP9} = 1, \quad (1d)$$

$$\sum_{v \in V} x_{DEP9,v} = 0, \quad (1e)$$

$$\sum_{v \in V} x_{DEP0,v} = 1, \quad (1f)$$

$$\sum_{d \in D} x_{s,d} = \sum_{d \in D} x_{d,s} = y_s, \quad \forall s \in S, \quad (1g)$$

$$\sum_{v \in V} x_{d,v} = \sum_{v \in V} x_{v,d} = 1, \quad \forall d \in D, \quad (1h)$$

$$\sum_{s \in S} y_s = n, \quad (1i)$$

$$x_{i,j} + x_{j,i} \leq 1 \quad \forall i, j \in V, \quad (1j)$$



$$a_{DEP0} = 0, \quad (1k)$$

$$a_s \geq a_d + t_{SEV}(d, s) - M \cdot x_{d,s}^c, \quad \forall s \in S, \forall d \in D, \quad (1l)$$

$$a_s \geq a_{s-1} + t_{PT}(s-1, s) + w_{s-1}, \quad \forall s \in S, s \geq 2, \quad (1m)$$

$$a_s \geq t_{SCH}(s), \quad \forall s \in S, \quad (1n)$$

$$a_s \geq t_{SEV}(DEP0, s) \cdot x_{DEP0,s}^c - M \cdot y_s^c, \quad \forall s \in S, \quad (1o)$$

$$a_d \geq a_s + c_2 + t_{SEV}(s, d) - M \cdot x_{s,d}^c, \quad \forall s \in S, \forall d \in D, \quad (1p)$$

$$l_1 = 0, \quad (1q)$$

$$l_s \geq a_{s-1} + w_{s-1} + t_{PT}(s-1, s) - t_{SCH}(s), \quad \forall s \in S, s \geq 2, \quad (1r)$$

$$x_{v,w}^c = 1 - x_{v,w}, \quad \forall v, w \in V, \quad (1s)$$

$$y_s^c = 1 - y_s, \quad \forall v, w \in V, \quad (1t)$$

$$w_s = y_s^c \cdot c_1 + y_s \cdot c_2 \quad \forall s \in S, \quad (1u)$$

$$x_{v,w}, x_{v,w}^c \in \{0, 1\}, \quad \forall v, w \in V, \quad (1v)$$

$$y_s, y_s^c \in \{0, 1\}, \quad \forall s \in S, \quad (1w)$$

$$a_v \geq 0, \quad \forall v \in V, \quad (1x)$$

$$w_s \geq 0, \quad \forall s \in S \quad (1y)$$