## (Towards) A better understanding of delays from Switches & Crossings

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## Background: Switches & Crossings

- □'Points' along the railway network where tracks merge into, diverge from, or cross each other
- Main function: network flexibility, capacity & safety

□Notorious source of disruptions on the railway network

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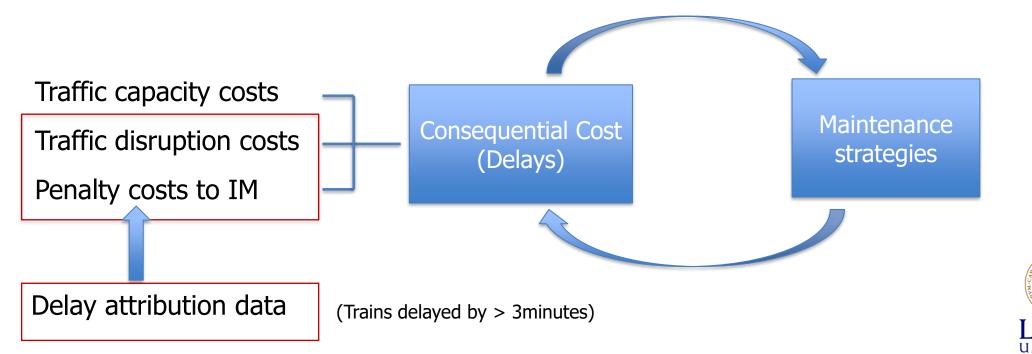




## Miantenance of Switches & Crossings

□Studies combine Life Cycle Cost (LCC) and Reliability analyses to determine the most optimal and cost-effective maintenance strategies. (Ait-Ali et al., 2024; Odolinski et al., 2023).

LCC Nissen (2009) = (Acquisition + Maintenance + Consequential) cost



## Study aim and research questions

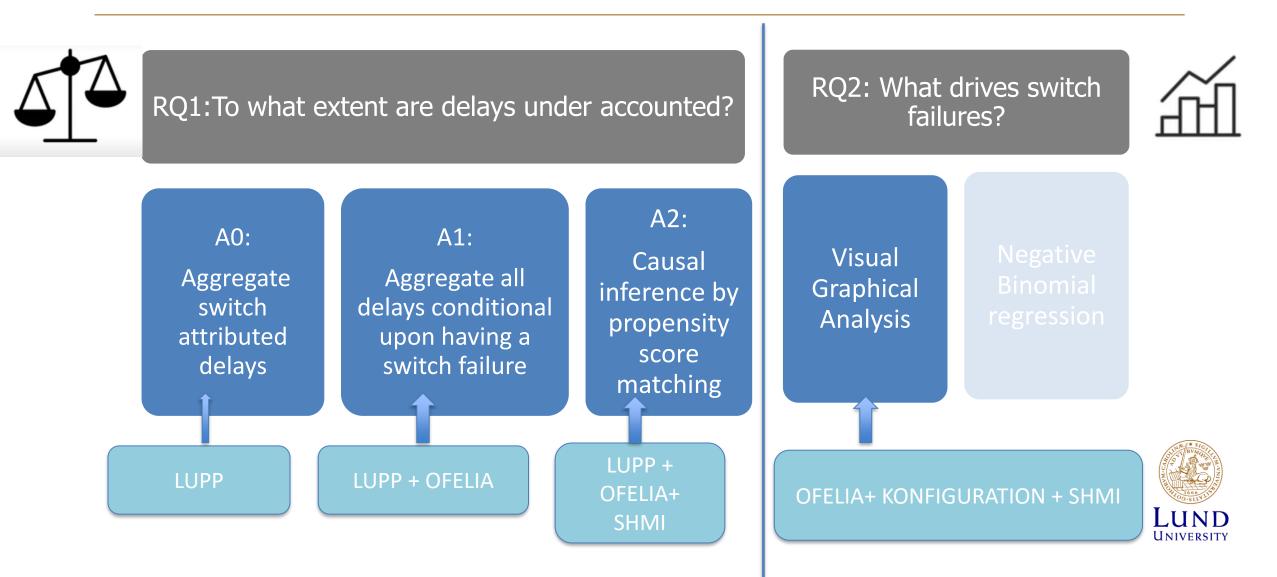
The overall goal of the study is to determine the levels of maintenance required to keep disruptions from switches and crossings minimal

### **RESEARCH QUESTIONS**

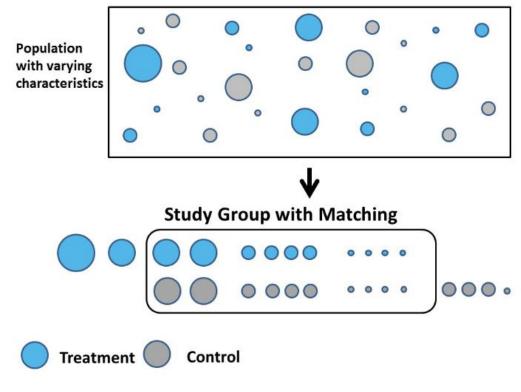
- 1. To what extent are delays underreported/estimated?
- 2. What is driving switch failures (and associated delays) on the Swedish railway network?
- 3. What is a better way to estimate the delay impact of S&Cs?
- 4. How should S&C maintenance strategies change to reduce disruptions ?



### Method overview



## Propensity score matching



https://ar.inspiredpencil.com/pictures-2023/propensity-score

□ Causal inference technique

□ Used in medical studies in non-randomized trials

Aims to create control subjects from observational data



# Propensity score matching

□ Step 1: Propensities are computed as the logistic probability of a switch failing (treatment)

$$ps_i = \Pr(T_i = 1) = \frac{e^{\hat{B}x_i}}{1 + e^{\hat{B}x_i}}$$

Where  $ps_i$  is the is the propensity score for the i-th observation and  $T_i$  is a binary variable representing the treatment assignment (switch failure) and  $\hat{B}$  is estimated from the logistic model.

Independent variables used : Average maximum daily temperature, Average maximum snow depth, track type, percentage of freight trains & total trains

□ Step 2: Observations in the control and treatment groups are subsequently matched based on Equation 2

 $min|ps_i - ps_j|$ 

Where psi is the propensity score for an observation in the treatment group and psj is the propensity score for an observation in the control group.

□ Step 3: The average effect is determined as the mean difference in outcome (Average delay minutes per train) across all pairs. A paired t-test is used to evaluate the statistical significance of the difference

$$y_{1i} - y_{0i} = y_i - y_j$$

Step 4: Use a paired t-test to evaluate difference in the outcome variable (Average delay minutes per train) for the treatment and control group

Total delays = Average Delay Impact \* 
$$\sum_{m=1}^{n}$$
 Number of delayed trains  $m$ 

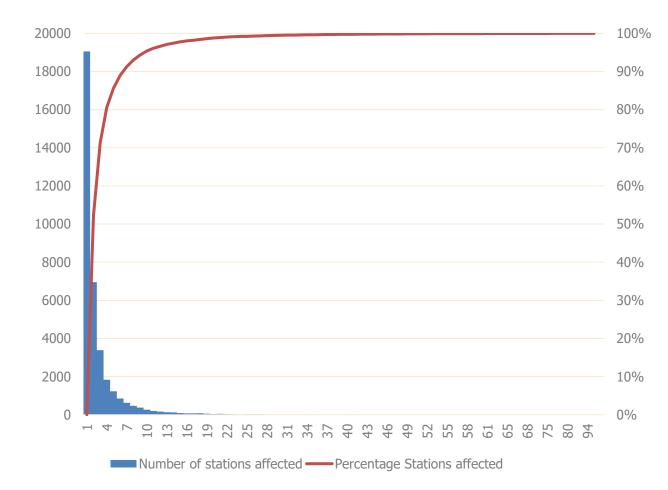


Where, m, is a section on the network with a faulty switch.

### **INSIGHTS RQ1**



### Distribution of the number of stations affected by a switch failure



52% of failures affect only one station
19% affect two stations,
9% affect three stations,
5% affect four stations and
3% affect five stations.

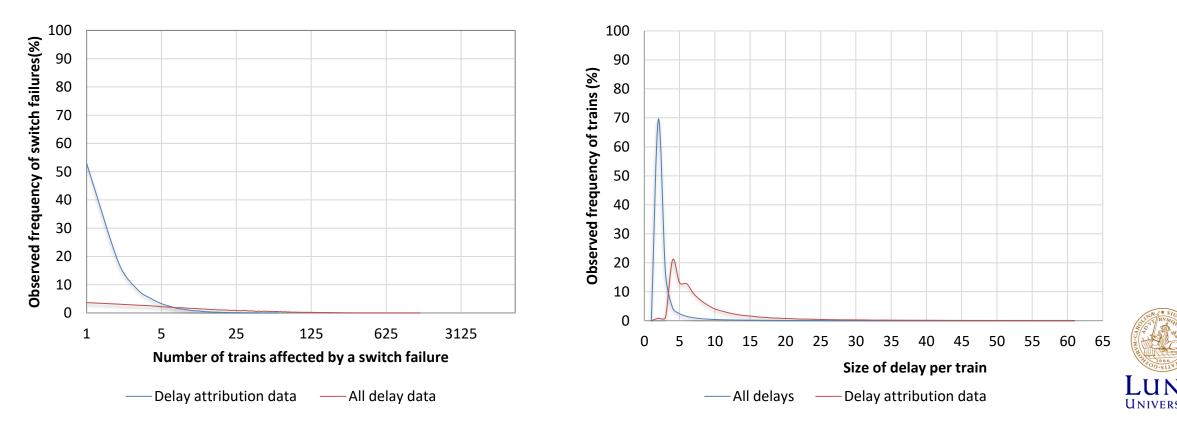
Overall, up to ~ 90% of all switch failure events affect five stations and below



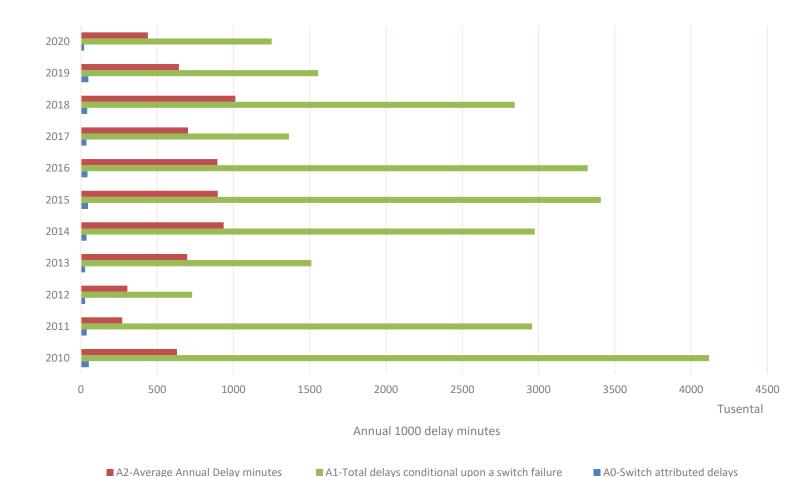
# Distribution of the number of trains affected by a switch failure & the delay size

□ For the period 2001 – 2020; 36,479 switch events in LUPP vs 185,225 switch failures in the event report database (Ofelia)

✓ Computations based on delay attribution only account for the impact of 19.7% is accounted for.



### Comparison of estimates from different approaches



□ Average delay per train = 2.3 minutes (Causal inference)

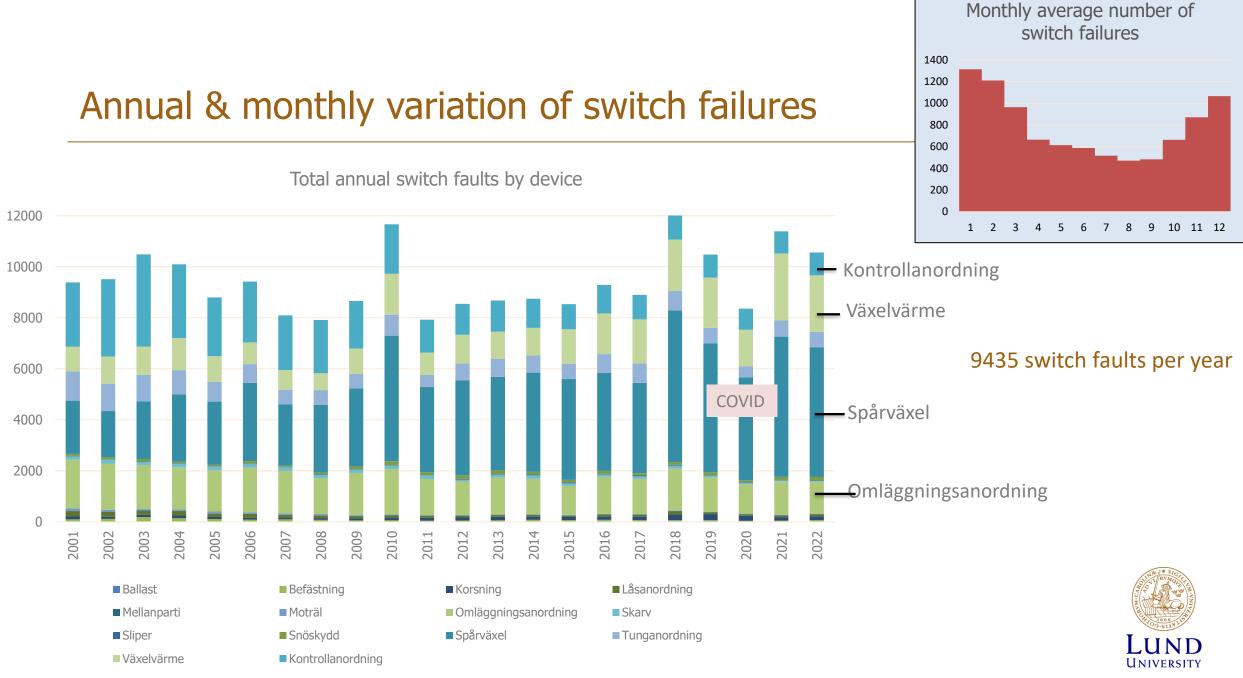
Switch attributed delays = 6.4% Total delays conditional upon a switch failure

□ Switch attributed delays = 18% Average annual delay minutes



### **INSIGHTS RQ2**





### Highest switch failure rates on the swedish railway network

|    | Station       | Nr_Switches_2017 | Nr_Switch_Failures | Failure_Rate |
|----|---------------|------------------|--------------------|--------------|
| 1  | Laduberg      | 4                | 18                 | 4.500        |
| 2  | Mo grindar    | 2                | 9                  | 4.500        |
| 3  | Sävastklinten | 4                | 18                 | 4.500        |
| 4  | Sandträsk     | 4                | 17                 | 4.250        |
| 5  | Kopparåsen    | 8                | 31                 | 3.875        |
| 6  | Löten         | 2                | 7                  | 3.500        |
| 7  | Ripats        | 10               | 34                 | 3.400        |
| 8  | Lakaträsk     | 10               | 32                 | 3.200        |
| 9  | Stordalen     | 6                | 17                 | 2.833        |
| 10 | Gullträsk     | 8                | 22                 | 2.750        |
| 11 | Höör          | 14               | 35                 | 2.500        |
| 12 | Tågarp        | 4                | 10                 | 2.500        |
| 13 | Träskholm     | 4                | 10                 | 2.500        |
| 14 | Rensjön       | 12               | 29                 | 2.417        |
| 15 | Ljuså         | 6                | 14                 | 2.333        |
| 16 | Isätra        | 4                | 9                  | 2.250        |
| 17 | Östra Grevie  | 4                | 9                  | 2.250        |
| 18 | Via           | 6                | 13                 | 2.167        |
| 19 | Järneträsk    | 4                | 8                  | 2.000        |
| 20 | Koskivaara    | 8                | 16                 | 2.000        |

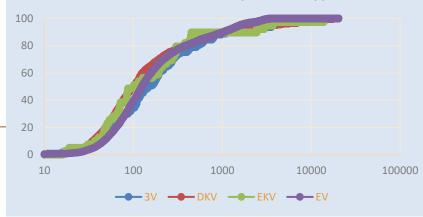


### Delay risk due to switch failures (year 2017)

|    | Station        | Number of<br>switches | Number of<br>switch<br>failures | Switch<br>failure rate<br>(FR) | Number of<br>trains<br>(T) | FR*T   |
|----|----------------|-----------------------|---------------------------------|--------------------------------|----------------------------|--------|
| 1  | Tomteboda övre | 52                    | 72                              | 1.385                          | 292786                     | 405509 |
| 2  | Karlberg       | 68                    | 88                              | 1.294                          | 269618                     | 348886 |
| 3  | Skavstaby      | 32                    | 39                              | 1.219                          | 180528                     | 220064 |
| 4  | Stockholm C    | 248                   | 215                             | 0.867                          | 214037                     | 185570 |
| 5  | Solna          | 102                   | 73                              | 0.716                          | 248556                     | 177966 |
| 6  | Årstaberg      | 14                    | 12                              | 0.857                          | 200177                     | 171552 |
| 7  | Höör           | 14                    | 35                              | 2.500                          | 67215                      | 168038 |
| 8  | Flemingsberg   | 34                    | 42                              | 1.235                          | 132608                     | 163771 |
| 9  | Älvsjö         | 134                   | 92                              | 0.687                          | 194398                     | 133551 |
| 10 | Huvudsta       | 16                    | 29                              | 1.813                          | 69338                      | 125710 |



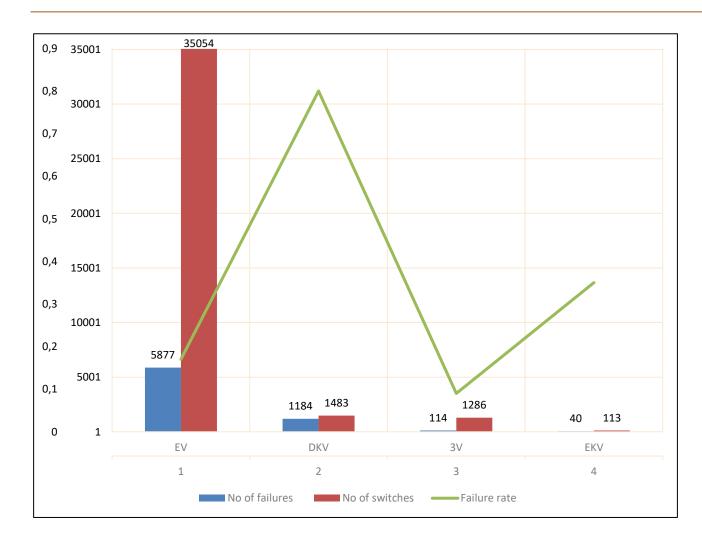
Restoration time by Switch type



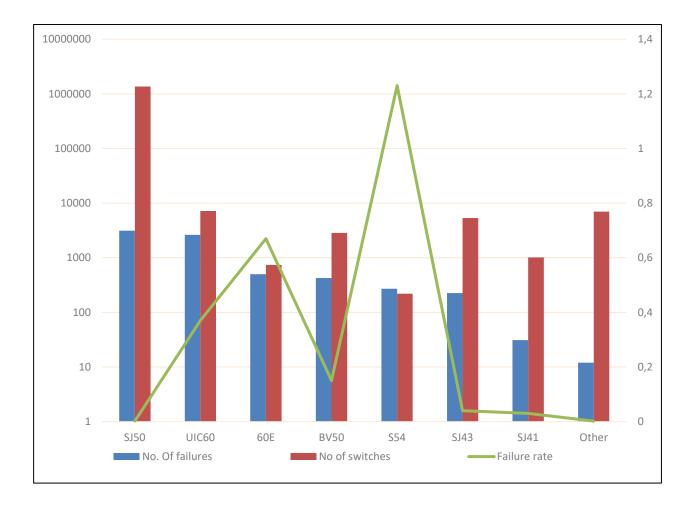
- DKV (Dubbel korsningsväxel) have the highest failure rate
- No major difference in restoration time

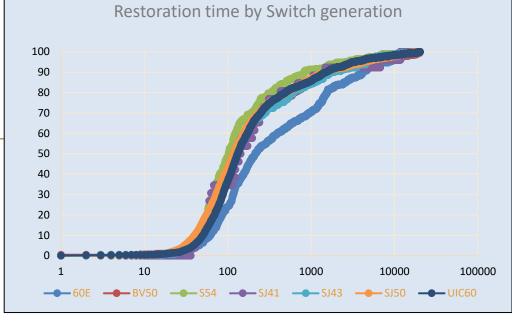


## Failure rate of switches by type



## Failure rate of switches by gen.





- S54 have the highest failure rate
- Restoration time for S54
   switches > = +100 minutes
   Restoration time for 60E



### Summary & Next steps

□ Reliance on delay attribution data results in a substantial under-estimation of S&C delay impact

There is evidence of weather (cold), size of station (load) driving switch failure, switch type

#### NEXT STEPS

Devise a method to systematically define the impact of a switch

□ Relative influence of different factors of influence



