

# Evaluating the Quality of Railway Timetables

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## Supply x Demand

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Figure : Calvin and Hobbes by Bill Watterson

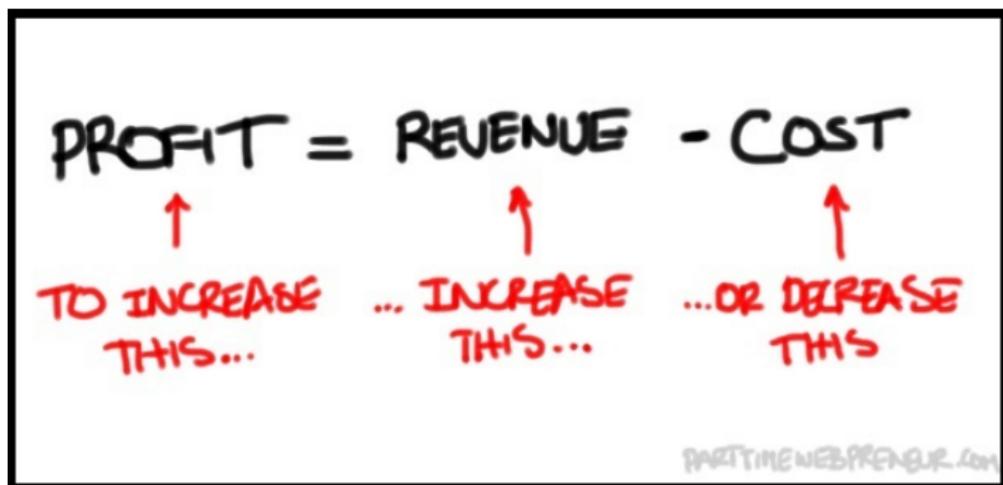
## Purely commercial rail passenger services in Europe

	Market closed for commercial national rail passenger services.
	Open access, but no external RUs providing commercial national rail passenger services.
	Open access with external RUs providing commercial national rail passenger services.
	AT and CZ: commencing end of 2011, external RUs providing purely commercial national rail passenger services.



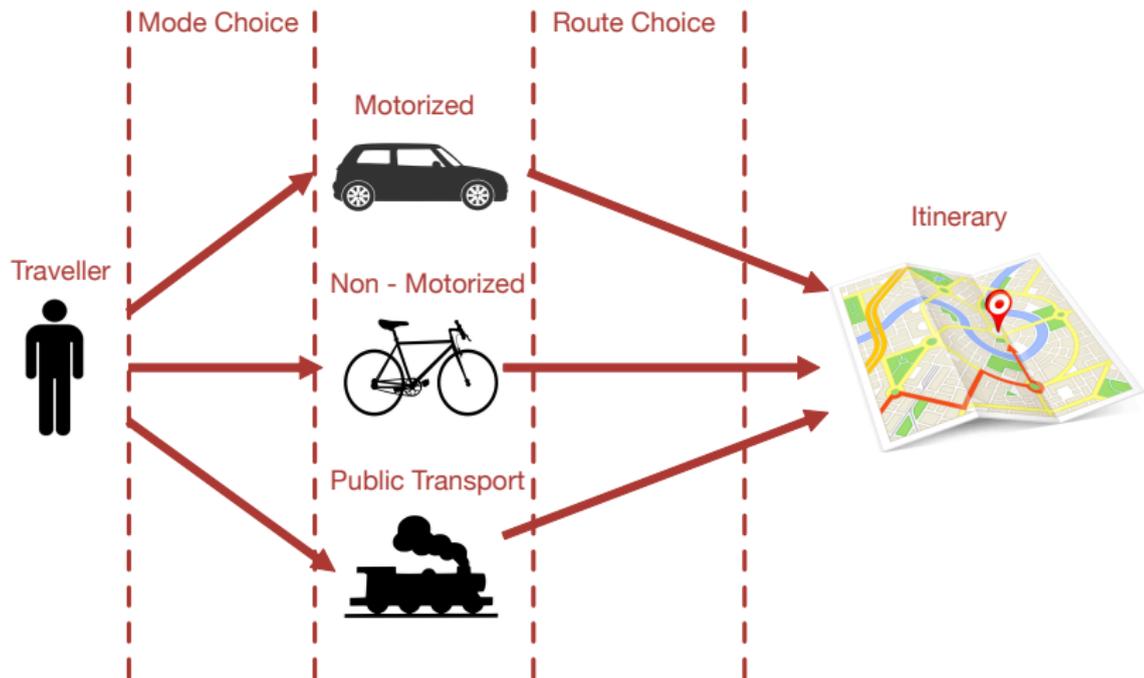
## TOC Point of View

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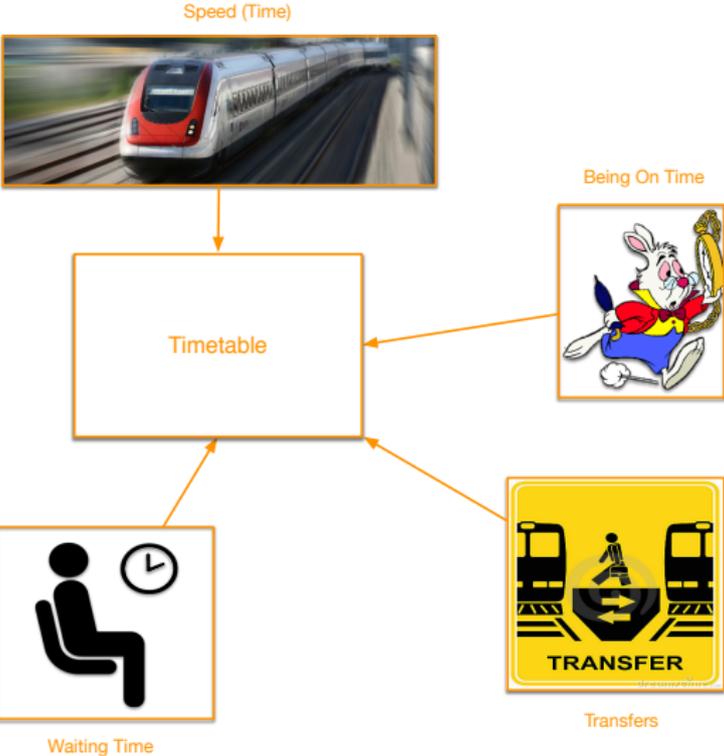


# Transport Demand

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# Passenger Point of View



# Passenger Satisfaction

Satisfaction of a passenger ( $i, t$ ) for a given alternative/path  $p$ :

$$U_i^t = - \sum_{\ell \in L^p} r_i^{p\ell} + \beta_W \cdot w_i^{tp} + \beta_T \cdot (|L^p| - 1) + \beta_E \cdot \delta_i^{tp} + \beta_L \cdot \gamma_i^{tp} \text{ [min]}$$

where:

$L^p$  – set of lines in path  $p$

$r_i^{p\ell}$  – in-vehicle-time of a train line  $\ell$

$w_i^{tp}$  – total waiting time along path  $p$

$|L^p|$  – number of lines in path  $p$

$\delta_i^{tp}$  – early scheduled delay

$\gamma_i^{tp}$  – late scheduled delay

$\beta_W = -2.5$  (Wardman (2004))

$\beta_T = -10$  (de Keizer et al. (2012))

$\beta_E = -0.5$  (Small (1982))

$\beta_L = -1$  (Small (1982))

# Monetarization

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We can multiply the whole equation by the Value of Time:

$$\beta_{time} / \beta_{value} = 27.81$$

Chf/hour (Axhausen et al. (2008))

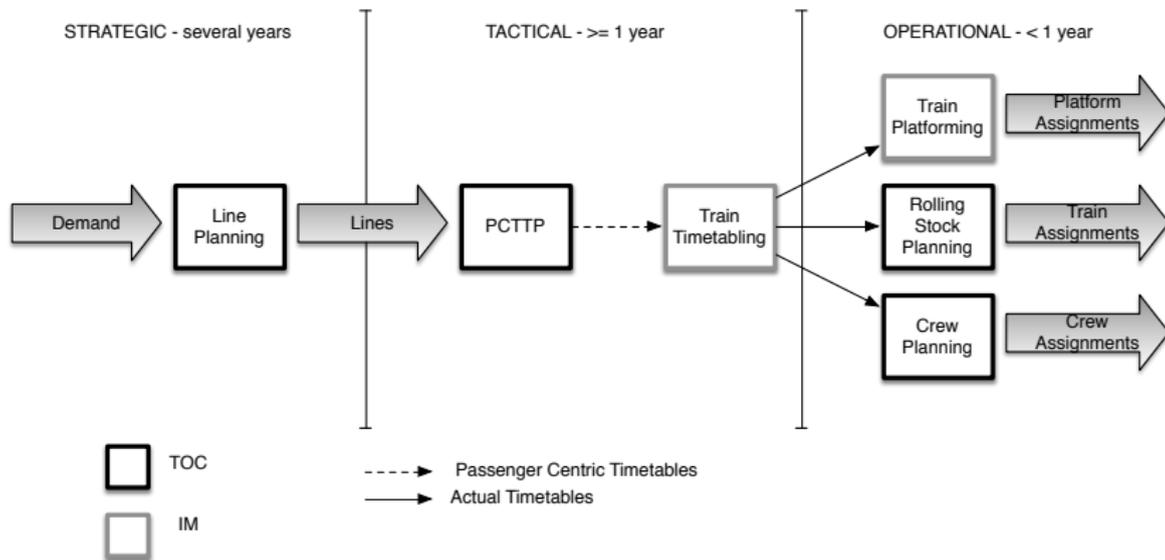
# References

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- Axhausen, K. W., Hess, S., König, A., Abay, G., Bates, J. J. and Bierlaire, M. (2008). **Income and distance elasticities of values of travel time savings: New Swiss results**, *Transport Policy* **15**(3): 173 – 185.
- de Keizer, B., Geurs, K. and Haarsman, G. (2012). **Interchanges in timetable design of railways: A closer look at customer resistance to interchange between trains.**, in AET (ed.), *Proceedings of the European Transport Conference, Glasgow, 8-10 October 2012 (online)*, AET.
- Small, K. A. (1982). **The Scheduling of Consumer Activities: Work Trips**, *The American Economic Review* **72**(3): pp. 467–479.
- Wardman, M. (2004). **Public transport values of time**, *Transport Policy* **11**(4): 363 – 377.

# Update of Planning



## Passenger

- OD Matrix
- Desired arrival time to D
- All paths
- Behavior



## Operator

- Network
- Fare structure
- Cost structure
- Rolling stock

# Decision Variables I



- $U_i^t$  – passenger satisfaction (utility)
- $w_i^t$  – the total waiting time of a passenger with ideal time  $t$  between OD pair  $i$
- $x_i^{tp}$  – 1 – if passenger with ideal time  $t$  between OD pair  $i$  chooses path  $p$ ; 0 – otherwise
- $\lambda_i^t$  – the scheduled delay of a passenger ( $i, t$ )
- $d_v^\ell$  – the departure time of a train  $v$  on the line  $\ell$  (from its first station)

## Decision Variables II



- $y_i^{tplv}$  – 1 – if a passenger with ideal time  $t$  between OD pair  $i$  on the path  $p$  takes the train  $v$  on the line  $l$ ; 0 – otherwise
- $z_v^l$  – dummy variable to help modeling the cyclicity corresponding to a train  $v$  on the line  $l$
- $\omega_{vs}^l$  – train occupation of a train  $v$  of the line  $l$  on a segment  $s$
- $\mu_v^l$  – number of train units of a train  $v$  on the line  $l$
- $\alpha_v^l$  – 1 – if a train  $v$  on the line  $l$  is being operated; 0 – otherwise

# Model

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$$\max (\text{revenue} - \text{cost}) \quad (1)$$

$$\text{passenger satisfaction} \geq \varepsilon \quad (2)$$

$$\text{satisfaction function} \quad (3)$$

$$\text{at most one path per passenger} \quad (4)$$

$$\text{link trains with paths} \quad (5)$$

$$\text{cyclicality} \quad (6)$$

$$\text{train scheduling} \quad (7)$$

$$\text{train capacity} \quad (8)$$

$$\text{scheduled delay} \quad (9)$$

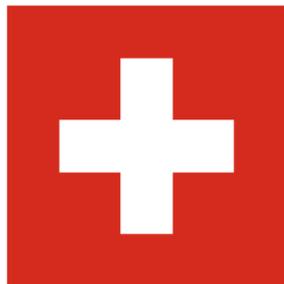
$$\text{waiting time} \quad (10)$$

# Case Study – Switzerland



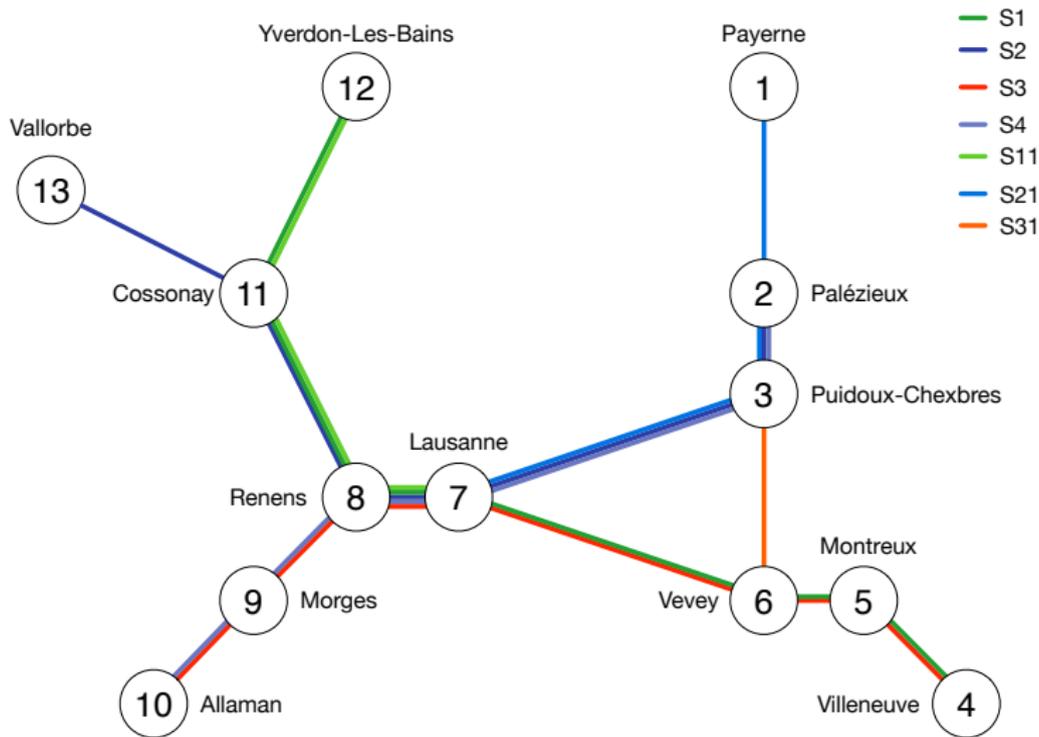
## SBB 2014 (5 a.m. to 9 a.m.)

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- OD Matrix based on observation and SBB annual report
- 13 Stations
- 156 ODs
- 14 (unidirectional) lines
- 49 trains
- Min. transfer – 4 mins
- VOT – 27.81 CHF per hour
- 3 scenarios – SBB 2014, cyclic PCTTP, non-cyclic PCTTP

# S-Train Network Canton Vaud, Switzerland



# Current Timetable (Morning Peak)

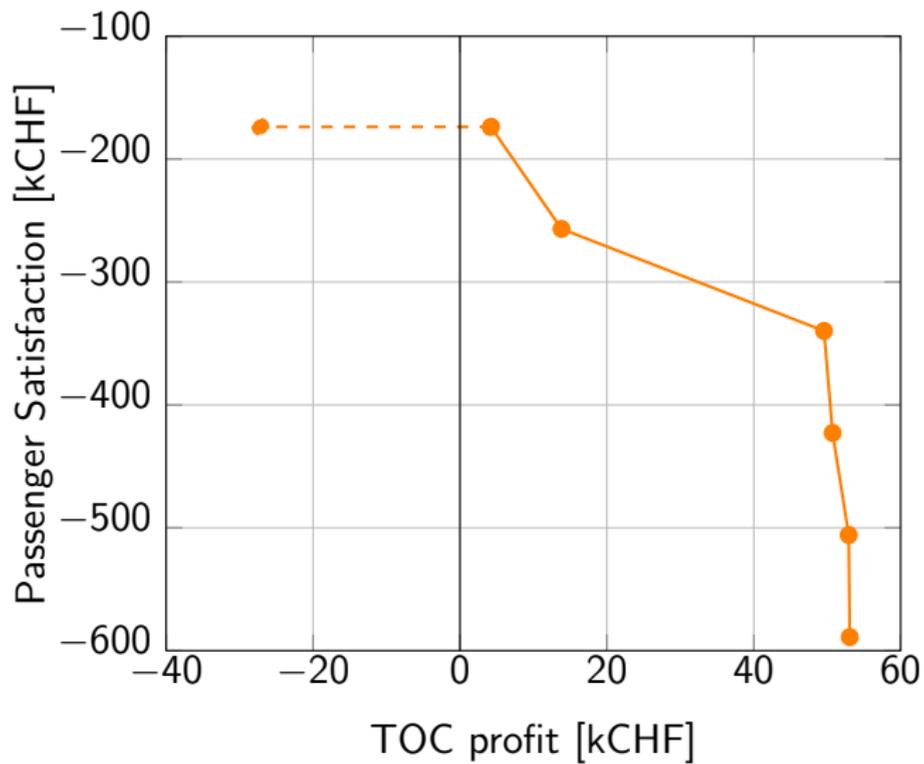
Line	ID	From	To	Departures			
S1	1	Yverdon-les-Bains	Villeneuve	–	6:19	7:19	8:19
	2	Villeneuve	Yverdon-les-Bains	5:24	6:24	7:24	8:24
S2	3	Vallorbe	Palézieux	5:43	6:43	7:43	8:43
	4	Palézieux	Vallorbe	–	6:08	7:08	8:08
S3	5	Allaman	Villeneuve	–	6:08	7:08	8:08
	6	Villeneuve	Allaman	–	6:53	7:53	8:53
S4	7	Allaman	Palézieux	5:41	6:41	7:41	8:41
	8	Palézieux	Allaman	–	6:35	7:35	8:35
S11	9	Yverdon-les-Bains	Lausanne	5:26*	6:34	7:34	8:34
	10	Lausanne	Yverdon-les-Bains	5:55	6:55	7:55	8:55
S21	11	Payerne	Lausanne	5:39	6:39	7:38*	8:39
	12	Lausanne	Payerne	5:24	6:24	7:24	8:24
S31	13	Vevey	Puidoux-Chexbres	–	6:09	7:09	8:09
	14	Puidoux-Chexbres	Vevey	–	6:31*	7:36	8:36

# Results – Current Demand SBB 2014 (cca. 11 000 pax)

$\epsilon$ [%]	0	20	40	60	80	100	100*
profit [CHF]	53 067	52 926	50 730	49 564	13 826	4 211	-27 168
satisfaction [CHF]	-588 934	-505 899	-422 864	-339 828	-256 793	-173 759	-173 758
ub/lb [CHF]	54 046	54 598	54 776	54 394	54 600	51 195	168 016
gap [%]	1.84	3.16	7.98	9.74	294.91	1115.74	3.30
gap [CHF]	979	1 672	4 046	4 830	40 774	46 984	5 742
drivers [-]	17	17	22	22	46	48	49
rolling stock [-]	32	32	32	32	46	55	98
covered [%]	99.35	99.34	100.00	100.00	100.00	100.00	100.00

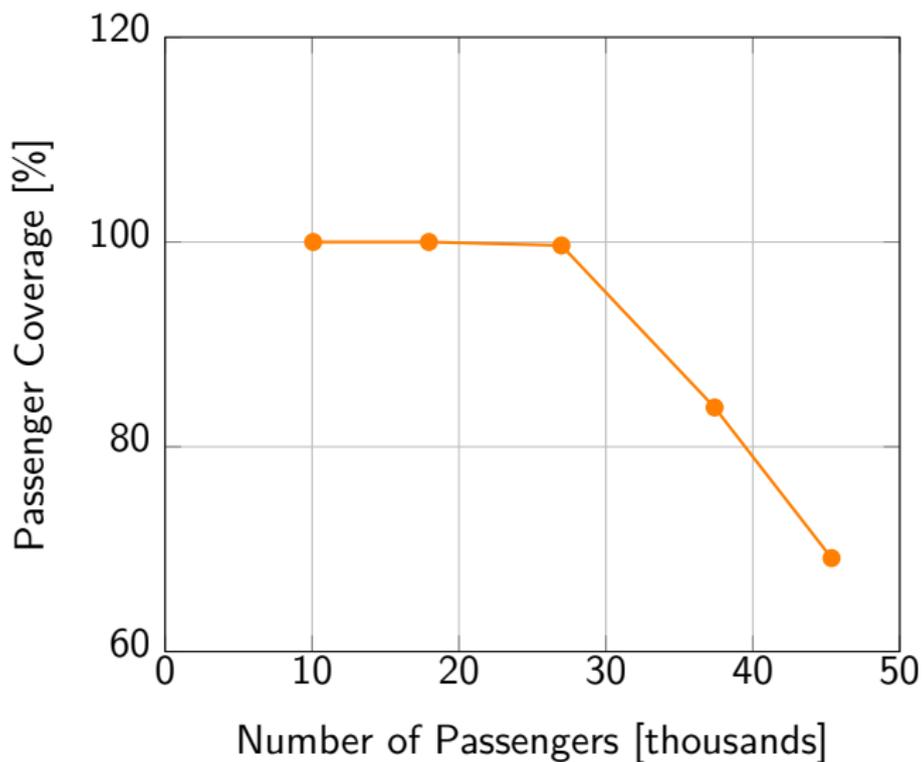
## Pareto Frontier

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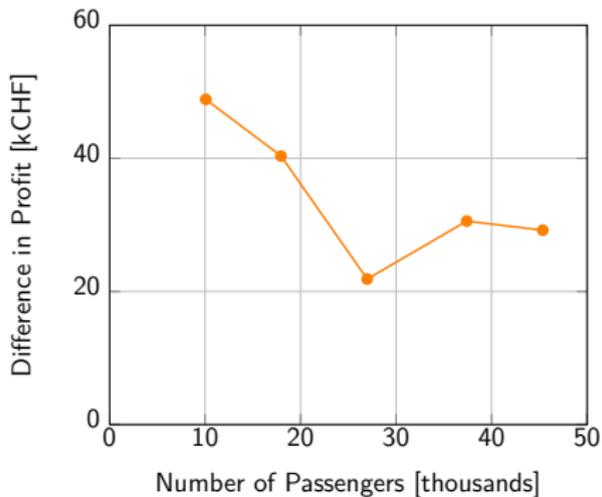
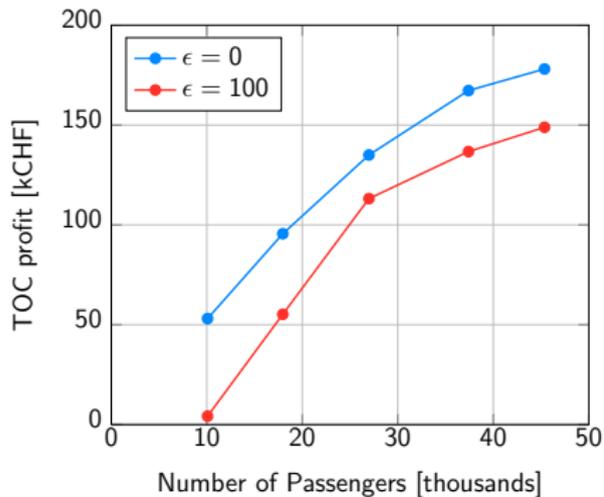


## Sensitivity Analysis on Passenger Congestion

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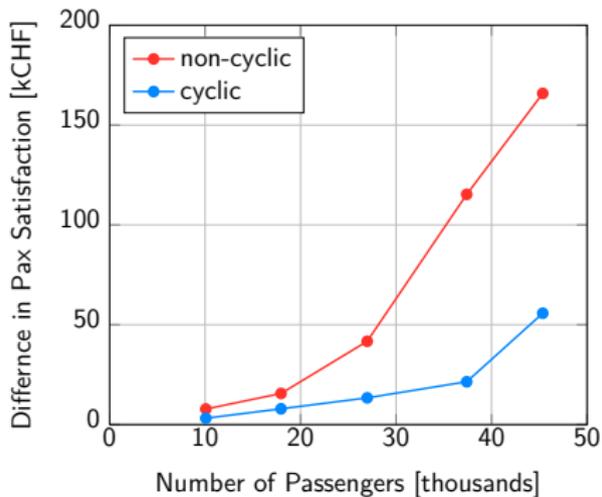
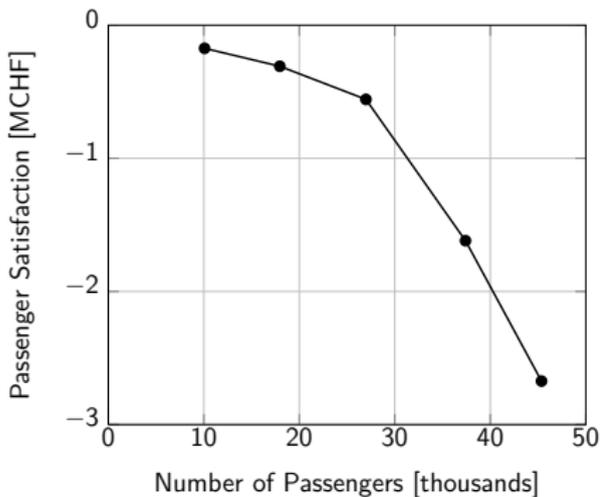


# Sensitivity Analysis – Operator

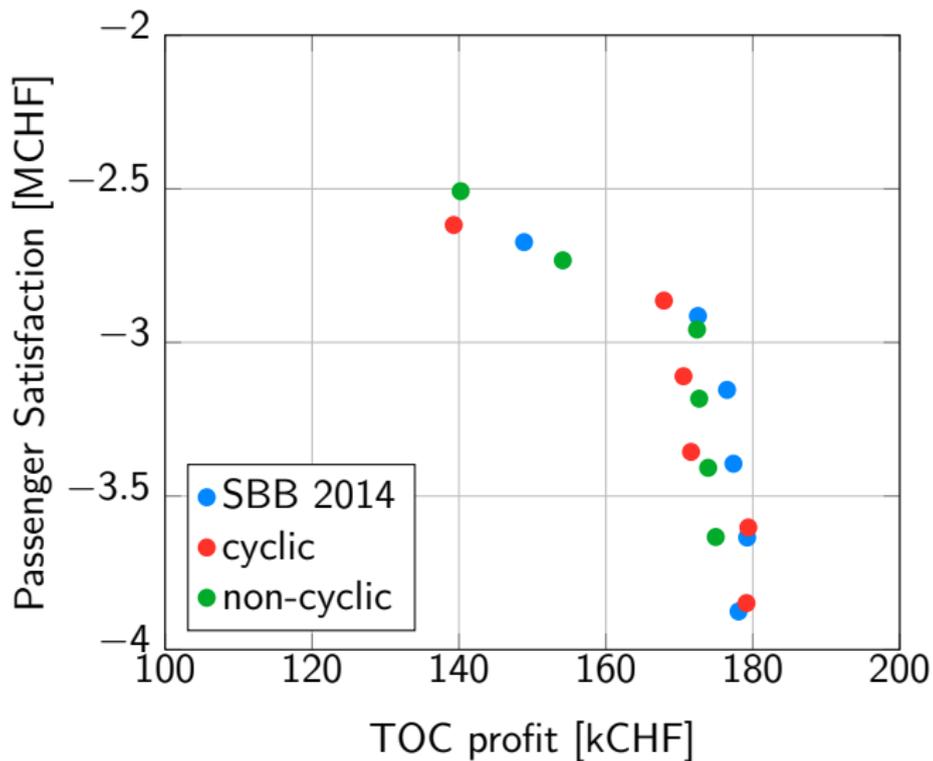


# Sensitivity Analysis – Passenger

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## Sensitivity Analysis – Pareto Frontiers



# Summary

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- Current demand
  - cyclic timetable is by 3 000 CHF better than the SBB 2014 timetable
  - the non-cyclic timetable is by 4 000 CHF better than the cyclic timetable
- Most congested
  - cyclic timetable is by 55 000 CHF better than the SBB 2014 timetable
  - the non-cyclic timetable is by 110 000 CHF better than the cyclic timetable

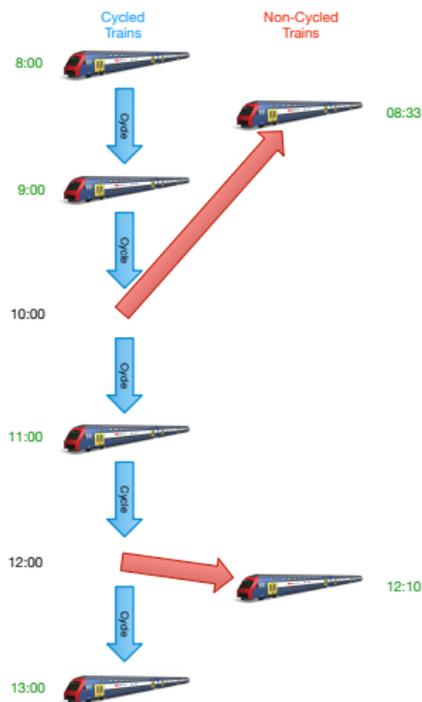
## Conclusions

- It is possible to find a good trade-off between the operator and the passengers (around  $\varepsilon = 40\%$ )
- Even at  $\varepsilon = 100\%$  the improvement is so large, that running this timetable with an increased ticket price can be justified
- The non-cyclic timetable is more flexible and can account better for high demand in high density network than the cyclic timetable

## Future Work

- Heuristics to solve for a full day
- Estimate the cost of cyclicity

# Cost of the Cyclicity



$$U_i^t = \dots + \beta_C \cdot \text{cyclic}$$

where:

- cyclic* – distance from cyclicity in %
- $\beta_C$  – cost of additional planning

$$\beta_C = \frac{27.81}{60/5} = 2.3175$$



**Thank you for your attention.**