# Optimizing seating probability in passenger trains

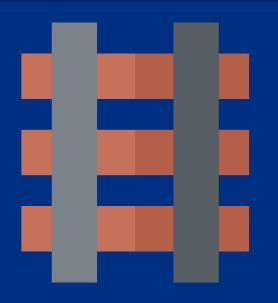
Simone Griffioen, Netherlands Railways (NS)



## Railways in The Netherlands

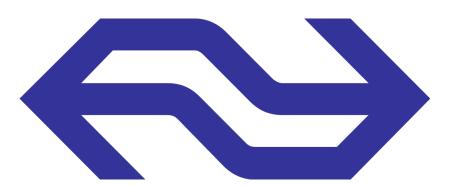






# ProRail









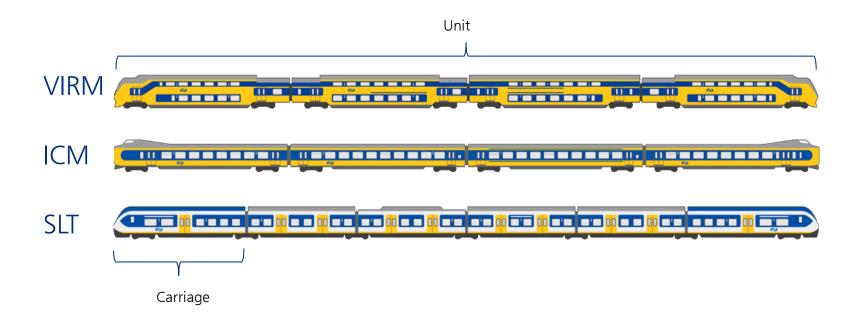




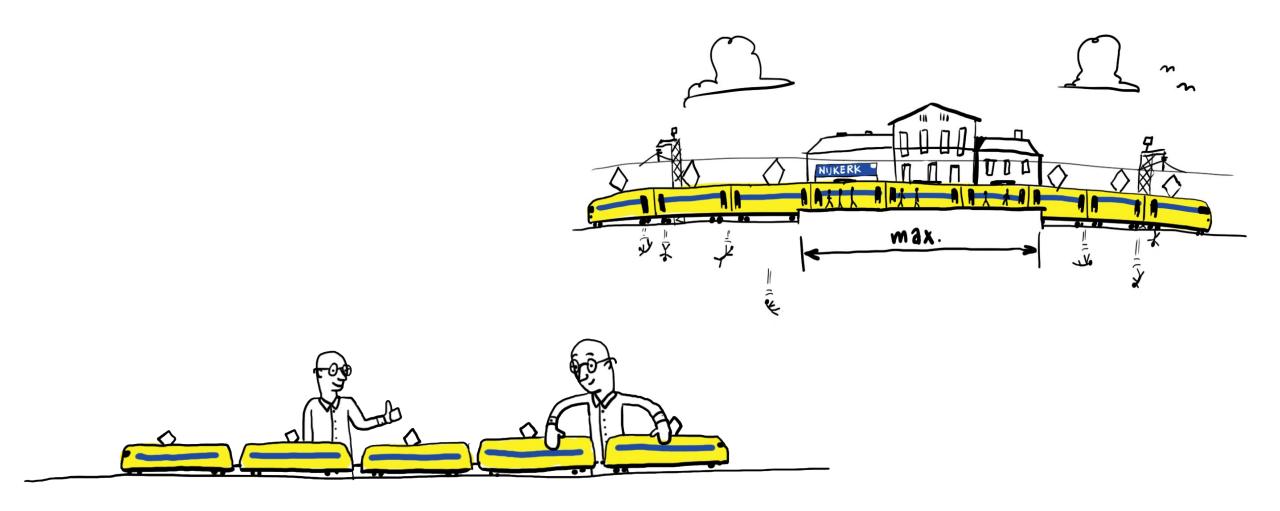


## NS Rolling Stock Planning

- 5000 trains in timetable per day
- 9 different rolling stock types
- 700 rolling stock units
- Which composition on which trip?

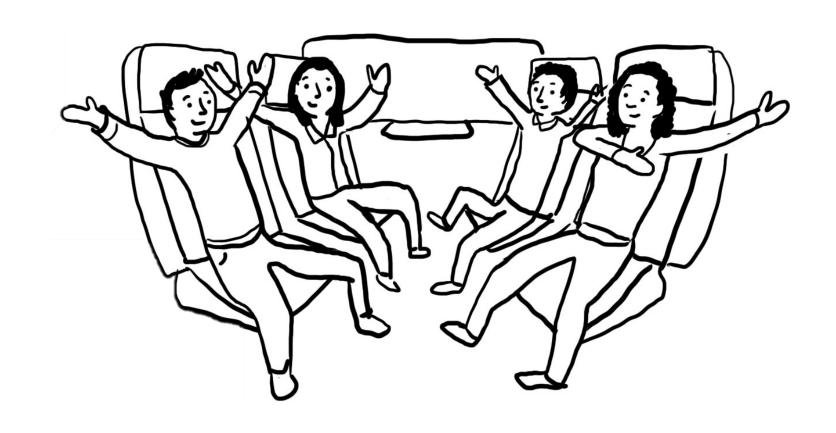


## Subject to a lot of constraints, for example



## Objective: Minimise costs, maximize service quality



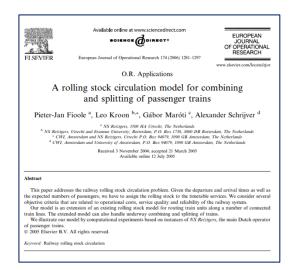


## TAM – rolling stock scheduling tool of NS

- in-house developed software, based on *Fioole et al. 2006*
- flexible, well-behaved MIP model, solved by CPLEX
- in production since 2011 (predecessor since 2007)

maintained by ORTEC since 2016

- TAM's essence
- trips  $t \in T$  and compositions  $p \in P$
- assigns a composition to each trip  $(x_{tp} \in \{0; 1\})$

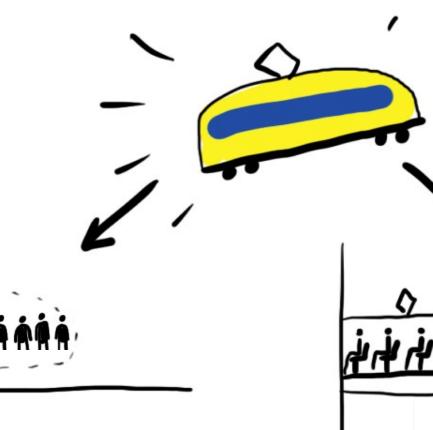




## Definition old KPI: "Passenger capacity"

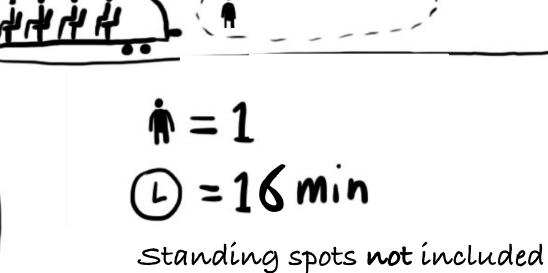
Capacity of train differs per time of day

- Seat capacity: only seats in use
- Total capacity: all seats in use and 2 standing pax per m<sup>2</sup> (rush hour <15min)



$$\dot{n} = 10$$

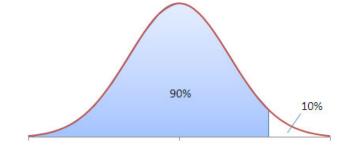
Standing spots included





## Service in the context of the old KPI: passenger capacity

- d: demand, namely 90th percentile
- c: allocated capacity (incl./excl. standing)

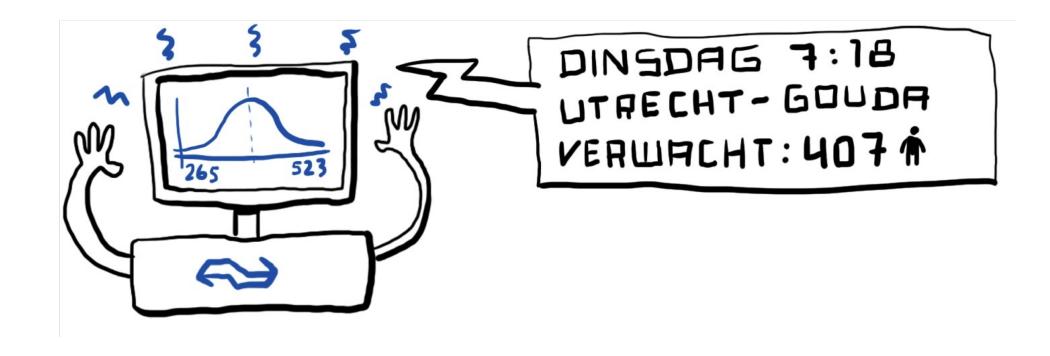


#### Old quantification of service quality

- dissatisfaction ("service pain") per trip, added up
- Service pain of a trip := shortage kilometres, defined as

pain = distance 
$$\cdot$$
 max  $\{0; d - c\}$ 

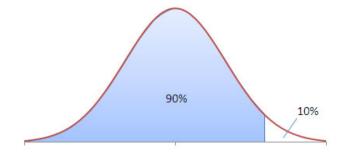
### Better forecasts: better KPI possible?





#### Service in the context of the new KPI

- c: allocated seat capacity
- $\xi$ : demand, a **random variable**



#### New quantification of service quality

- dissatisfaction ("service pain") per trip, added up
- Service pain of a trip := expected standing minutes

pain = duration 
$$\cdot$$
 E(number of standing passengers)

• i.e.,

pain' = duration 
$$\cdot \int_0^\infty max\{0; \xi - c\} dF(\xi)$$



## Service quality in TAM

Classic TAM (with shortage kilometres)

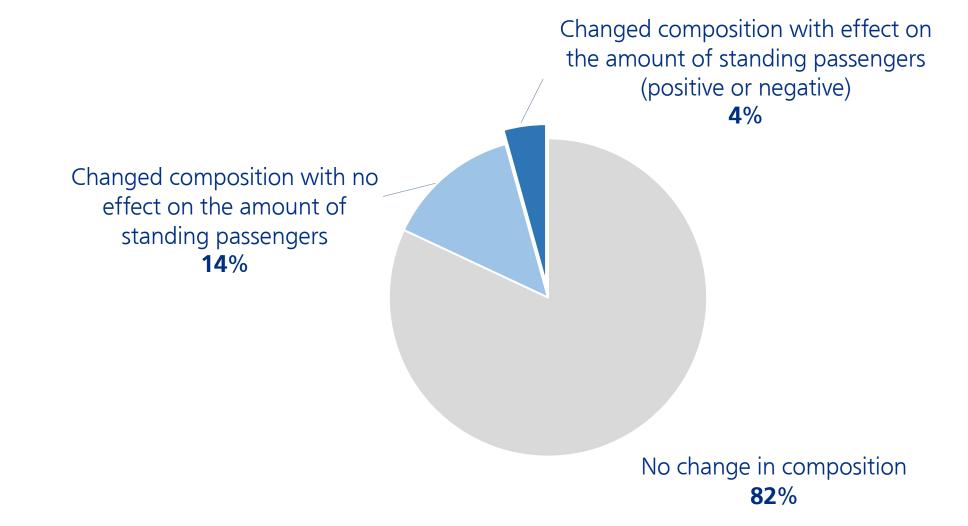
• minimise  $\Sigma_t \Sigma_p$  pain $_{tp} X_{tp}$ • linear objective in terms of  $X_{tp}$ 

- TAM<sup>+</sup> (with standing minutes)
  - minimise E(total standing minutes)
  - · looks like a stochastic program
  - good news: no recourse action

• minimise  $\Sigma_{\rm t} \, \Sigma_{\rm p}$  pain'  $_{\rm tp} \, {\rm x}_{\rm tp}$  • again, *linear objective* in terms of  ${\rm \textit{X}}_{tp}$ 

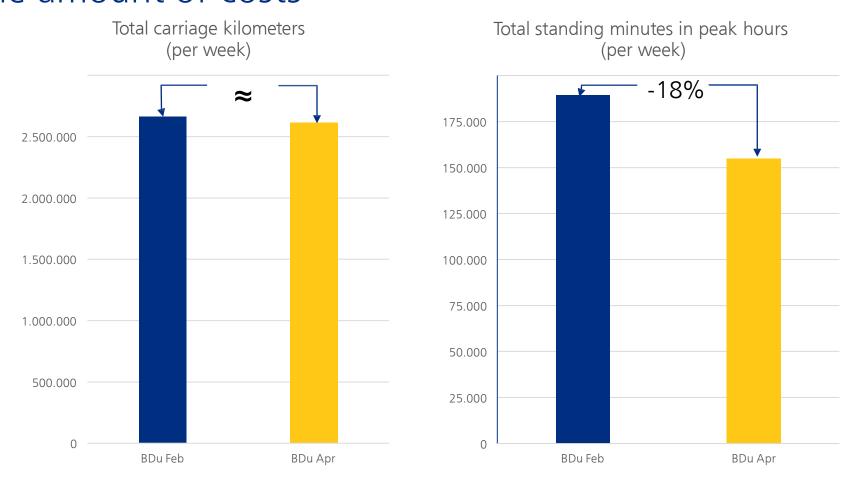


## Small amount of changes ....





## ... lead to a significant decrease in planned standing minutes against the same amount of costs





## From theory to practice



The plan changes!?!

Managing stakeholder expectations

trust in optimization

Black/white to sliding scale



## New sofa creates dust?



## Changing forecasts to enforce a composition



The plan changes!?!

It does fit in the official workschedule, but not in the "real" one

trust in optimization

Changing forecasts to enforce a composition does not "work" anymore

Black/white to greyscale

And much more...



## Success factors in the implementation



- Strong management support
- Early involvement of planners and continuous support available
- Changing tooling to help planners with other work
- Compromise: lose optimality but win in willingness to change

### Are we there yet?

- "Standing minutes" is now a household name, used in more and more places, decision making dashboards, etc.
- New KPI did also in practice improve the actual passenger service

#### But...

- Transition from long term planning to short term planning can be improved
- Remnants of old KPI can still be found in mindsets
- We still need to provide support for dealing with the optimization and the new KPI

...we still have a job! (luckily)

