## Non-pool based line planning

Optimization in public transport

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ERC project EngageS at TU Darmstadt

EngageS: Next Generation Algorithms for Grabbing and Exploiting Symmetry

- all areas of CS, mathematics, OR: intrinsic symmetries
- detect & exploit symmetry algorithmically,
- bring theory and practice closer together



TU Darmstadt, Hesse, Germany



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minimize costsmaximize robustness

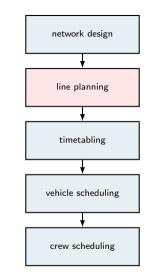
Operator:

Passengers: minimize perceived travel time

Public transport planning: a sequential process

 maximize convenience

minimize delays



#### 3

## Line planning: literature

- heuristics for bus transit networks
   [Wan and Lo, 2003, Kepaptsoglou and Karlaftis, 2009, Farahani et al., 2013, Arbex and da Cunha, 2015, Cancela et al., 2015]
- maximizing direct travelers/minimizing perceived travel time
   [Bussieck et al., 1997, Schöbel and Scholl, 2006, Goerigk and Schmidt, 2017, Bull et al., 2018]
- minimizing costs

[Claessens et al., 1998, Şahin et al., 2020, Torres et al., 2008, Torres et al., 2011]

line planning while generating lines
 [Borndörfer et al., 2007, Torres et al., 2011,
 Gattermann et al., 2017, Borndörfer et al., 2018,
 Pätzold et al., 2018, Masing et al., 2022]



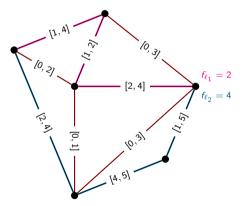
## Cost-minimal line planning on all lines (LPAL)

- public transport network (PTN)
- line: simple path in PTN
- In the concept  $(\mathcal{L}, f)$  such that
  - $\rightarrow$  frequency constraints satisfied

$$f_{e}^{\min} \leq \underbrace{F_{e}^{(\mathcal{L},f)}}_{\substack{\sum \\ \ell \in \mathcal{L} : e \in E(\ell)}} f_{\ell} \leq f_{e}^{\max}$$

 $\rightarrow~{\rm costs}$  are minimized

$$egin{aligned} \mathsf{cost}((\mathcal{L},f)) &= d_{\mathsf{fix}} \cdot |\mathcal{L}| + \sum_{\ell \in \mathcal{L}} f_\ell \cdot \mathsf{cost}_\ell \ & \mathsf{cost}_\ell = c_{\mathsf{fix}} + \sum_{e \in E(\ell)} c_e \end{aligned}$$



## Complexity results

class	only frequency-dependent costs $(d_{fix}=0)$	with frequency-independent costs $(d_{ m fix}>0)$
stars	polynomial ([3])	NP-hard ([3])
paths	polynomial for $f^{max}\equiv\infty$ ([1])	NP-hard ([3])
trees	pseudo-polynomial ([3]) polynomial for $f^{min} = f^{max}$ ([3])	NP-hard ([3])
planar	NP-hard, even for $\{0,1\}$ input ([3])	NP-hard, even for $\{0,1\}$ input ([3])
general	NP-hard, even for $\{0,1\}$ input ([2])	NP-hard, even for $\{0,1\}$ input ([2])

[1] P. Gattermann, (2015), Generating Line-Pools, Master's thesis, Georg-August-Universität Göttingen

- [2] P. Gattermann, J. Harbering, and A. Schöbel, (2017), Line pool generation, Public Transport, 9(1-2):7–32
- [3] I. Heinrich, P. Schiewe, C. Seebach, (2022), Algorithms and Hardness for Non-Pool-Based Line Planning, ATMOS22

## Paths & frequency-independent costs

### Theorem

LPAL is NP-hard, even if G is a path and  $f^{\min} = f^{\max}$  or  $f^{\max} \equiv \infty$ .

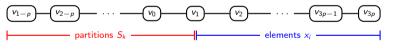
3-PARTITION Input:

• 
$$S = \{x_1, \dots, x_{3p}\},$$
  
•  $x_i \in \mathbb{N}_{>0}$ 

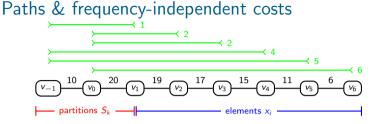
Find:

 $S_1 \sqcup \ldots \sqcup S_p = S,$  $\sum S_k = h = \sum S/p$ 

decision version of LPAL  $d_{
m fix}=1, \; c_{
m fix}=0, \; c\equiv 0, \; f^{
m min}=f^{
m max}, \; {\cal K}=3p$ 



$$f_{\{v_i, v_{i+1}\}}^{\min} = \begin{cases} (p-i) \cdot h & i \leq 0 \quad (\text{increasing}) \\ \sum_{j=i+1}^{3p} x_j & i > 0 \quad (\text{decreasing}) \end{cases}$$



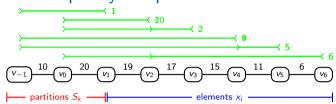
$$S = \{1, 2, 2, 4, 5, 6\},$$
  

$$p = 2, h = 10$$
  

$$S_1 = \{1, 4, 5\}, S_2 = \{2, 2, 6\}$$

For feasible partition construct  $(\mathcal{L}, f)$  feasible with  $cost(\mathcal{L}, f) \leq K$ :

• for 
$$x_i \in S_k$$
 construct line  $\ell_{i,k} = (v_{k-p}, \dots, v_i)$  with  $f_{\ell_{i,k}} = x_i$   
•  $S_1 \sqcup \dots \sqcup S_p = S \Rightarrow |\mathcal{L}| = 3p = K$   
•  $\sum_{\substack{\ell \in \mathcal{L}: \\ \text{left end at } v_{k-p}}} f_\ell = \sum_{i \in S_k} f_{\ell_{i,k}} = \sum S_k = h$   
• for  $k \in \{1 - p, \dots, 0\}$ :  $F_{\{v_k, v_{k+1}\}}^{(\mathcal{L}, f)} = \sum_{\substack{\ell \in \mathcal{L}: \\ \text{left end at } v_i, i \leq k}} f_\ell = (p - k)h = f_{\{v_k, v_{k+1}\}}^{\min}$   
• for  $j \in \{1, \dots, 3p\}$ :  $F_{\{v_j, v_{j+1}\}}^{(\mathcal{L}, f)} = \sum_{\substack{\ell \in \mathcal{L}: \\ \text{right end at } v_i, i \geq k}} f_\ell = \sum_{\substack{i=j+1 \\ i=j+1}}^{3p} x_j = f_{\{v_j, v_{j+1}\}}^{\min}$ 



## Paths & frequency-independent costs

$$\begin{split} S &= \{1, 2, 2, 4, 5, 6\}, \\ p &= 2, \ h = 10 \\ S_1 &= \{1, 4, 5\}, \ S_2 &= \{2, 2, 6\} \end{split}$$

For  $(\mathcal{L}, f)$  feasible with  $cost(\mathcal{L}, f) \leq K$  construct partitions  $S_1, \ldots, S_p$ :

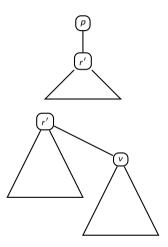
- $\wedge$  lines can have left and right end in  $\{v_1, \ldots, v_{3p}\}$
- total frequency of lines with left end at  $v_i$ ,  $i \in \{1 p, \dots, 0\}$ , is h
- line  $\ell_i$  with right end at  $v_i$ ,  $i \in \{1, ..., 3p\}$ , satisfies

$$f_{\ell_i} = x_i + \sum_{j=i}^{3p} \delta^{\mathsf{left\ end}}_{\ell_j, \mathbf{v}_i} \cdot f_{\ell_j}$$

transform solution in linear time

## Trees with $d_{\text{fix}} = 0$ and bounded $f^{\text{max}}$

- $f_e^{\max} \leq b$  for all  $e \in E$
- construct rooted tree from leafs by
  - introducing a parent: (T', r') → (T' + p, p) if p is the only neighbor of r' in V(T) \ V(T')
  - merging two trees (T<sub>1</sub>, r'), (T<sub>2</sub>, r') if r' has only one child v in T<sub>1</sub> or T<sub>2</sub>
- $\Rightarrow$  at most *b* lines end at *r*'
- dynamic program:
  - optimal objective value in  $\mathcal{O}(nb^3)$
  - optimal solution in  $\mathcal{O}(n^3b^3)$



## Current and future work

- exact polynomial-time algorithm for trees
- exact polynomial-time algorithm for cycles
- (parametrized) algorithms for parametric city and ring graphs
- (parametrized) algorithm for bounded treewidth
- including light spanners and optimal requirement graphs into our model



# kiitos