

# A Priori Route Evaluation for the Lateral Transshipment Problem (ARELTP) with Piecewise Linear Profits

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## Title of the talk:

A Priori Route Evaluation for the Lateral Transshipment Problem (ARELTP) with Piecewise Linear Profits and a Lotsizing Application with Requalification Costs.

the presentation covers:

- problem definition
- lot sizing application
- solution approaches (DP, B&B)
- computational experiments and results

- origin of the problem: Single Route Lateral Transshipment Problem (SRLTP)
- SRLTP: redistribution of inventories using one vehicle.
- extension to piecewise linear profits (PWLP).
- ARELTP: evaluation of a-priori routes for this problem

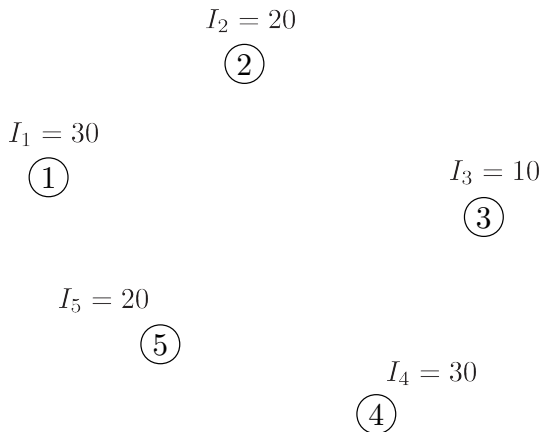
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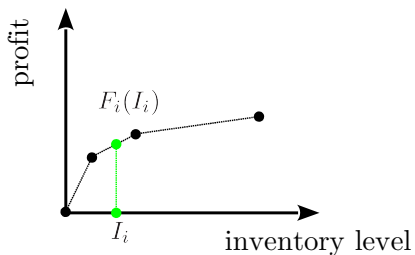
# lateral transshipment for a single route - SRLTP

initial inventory levels  $I_i$  at the local warehouses.



# lateral transshipment for a single route - SRLTP

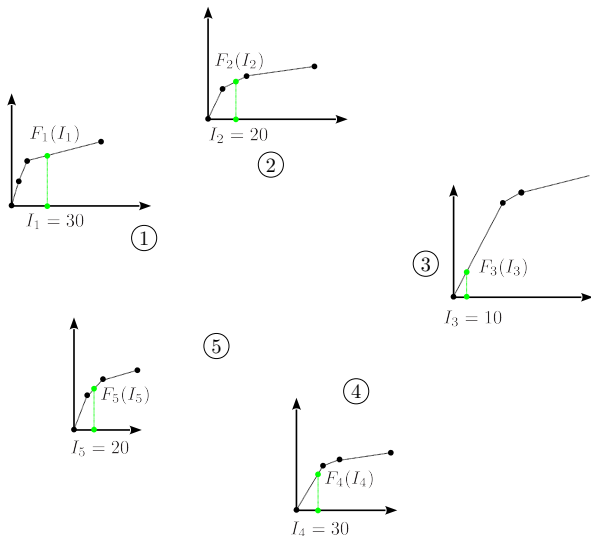
the PWLP function  $F_i$  for different inventory levels.





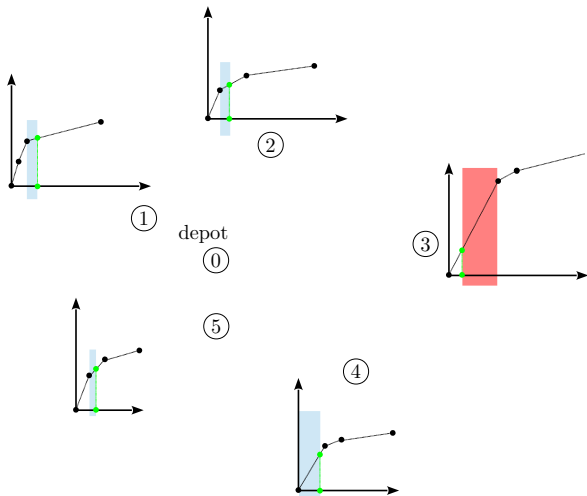
# lateral transshipment for a single route - SRLTP

changes of the inventory level  $y_i$  and the PWL profit function  $F_i$ .



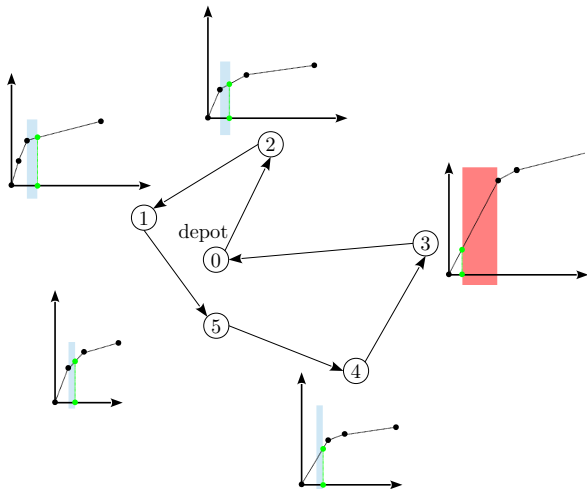
# lateral transshipment for a single route - SRLTP

What is a good redistribution?



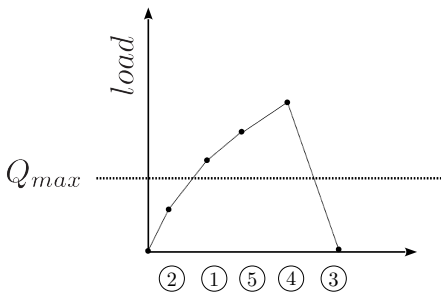
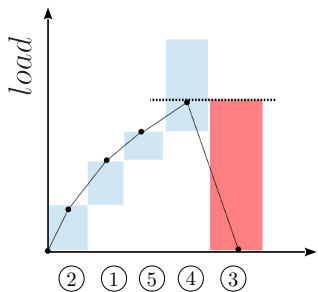
# lateral transshipment for a single route - SRLTP

not considered: load capacity, tour length constraint, travel costs.



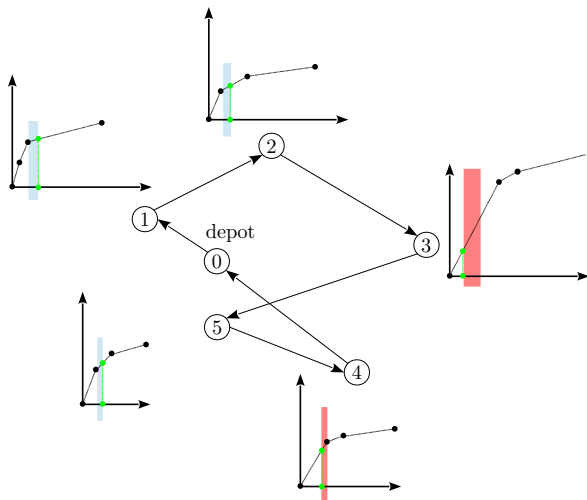
# lateral transshipment for a single route - SRLTP

considering the load capacity constraint



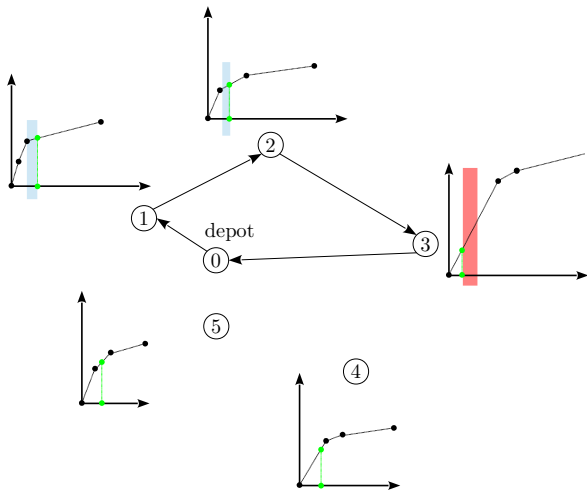
# lateral transshipment for a single route - SRLTP

considering the load capacity constraint



# lateral transshipment for a single route - SRLTP

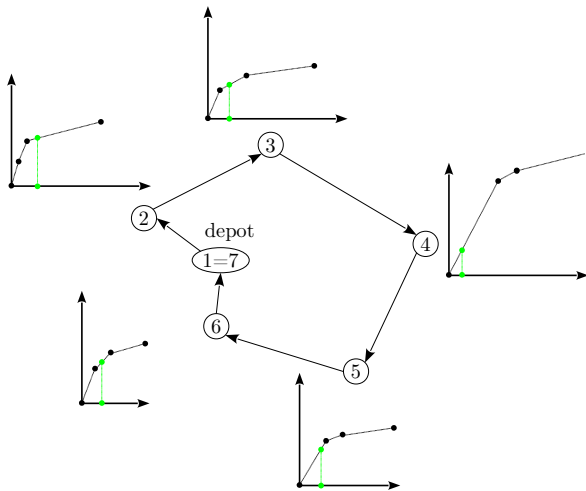
considering the distance constraint



# ARELTP: SRLTP for an a-priori route

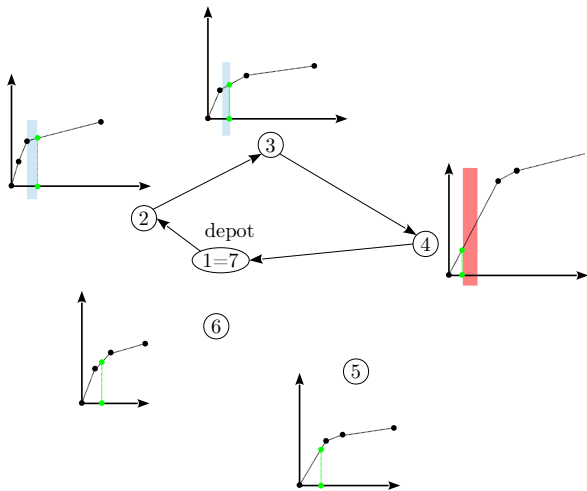
feasible solution for the a-priori route 1 – 2 – 3 – 4 – 5 – 6 – 7

- a route that starts in 1 and returns to 7
- indices of the visited customers are increasing



# ARELTP: SRLTP for an a-priori route

feasible route: 1 – 2 – 3 – 4 – 7





## motivation to use a-priori routes

- robustness (simple to implement in practice)
- consistency (improve the service quality)

performance issues may also be a motivation to use a-priori routes.

This presentation is about evaluating a single a-priori route for a single scenario (parameter setting) of the SRLTP with PLP.

## decision variables

- arc selection:  $x_{ij}$
- inventory change:  $y_i$  (remove  $y_i$ )

Remark: load when leaving  $i$  is  $\sum_{j \leq i} y_j$

## parameters

- depots for the truck:  $1, n$
- local warehouses:  $2, \dots, n - 1$ :
- revenue change:  $f_i$

$$f_i(y_i) = F_i(I_i - y_i) - F_i(I_i) \quad (a_i \leq y_i \leq b_i \text{ if } i \text{ is visited})$$

- costs:  $c_{ij}$
- time consumption:  $t_{ij}$  and upper bound  $T_{max}$
- load limit:  $Q_{max}$

# ARELTP: MIP formulation

$$\min \sum_{1 \leq i < j \leq n} c_{ij} x_{ij} - \sum_{1 \leq i \leq n} f_i(y_i) \quad (1)$$

$$s.t. \quad \sum_{j < i} x_{ji} = \sum_{j > i} x_{ij} \quad 1 < i < n \quad (2)$$

$$\sum_{j > 1} x_{1j} = 1 \quad (3)$$

$$\sum_{j < n} x_{jn} = 1 \quad (4)$$

$$a_i \sum_{j > i} x_{ij} \leq y_i \leq b_i \sum_{j > i} x_{ij} \quad 1 \leq i \leq n \quad (5)$$

$$0 \leq \sum_{j \leq i} y_j \leq Q_{max} \quad 1 \leq i \leq n \quad (6)$$

$$x_{ij} \in \{0, 1\} \quad 1 \leq i < j \leq n \quad (7)$$

$$y_i \in \mathbb{R} \quad 1 \leq i \leq n \quad (8)$$

$$\sum_{1 \leq i < j \leq n} t_{ij} x_{ij} \leq T_{max} \quad (9)$$

# ARELTP: MIP formulation

$$\min \sum_{1 \leq i < j \leq n} c_{ij} x_{ij} - \sum_{1 \leq i \leq n} f_i(y_i) \quad (1)$$

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$$\sum_{1 \leq i < j \leq n} t_{ij} x_{ij} \leq T_{max} \quad (9)$$

A polynomially solvable variant of the ARELTP is presented in [Hartl and Romauch(2013)]; simplifications:

- $c_{ij}$  is not considered
- $f_i$  is linear
- $T_{max}$  is not considered

ARELTP is NP hard if one of the following is true if:

- $c_{ij}$  is considered ( linear  $f_i$  and  $T_{max} = \infty$ )
- $f_i$  is piecewise linear ( $c_{ij} = 0$  and  $T_{max} = \infty$ )
- $T_{max}$  is considered ( linear  $f_i$  and  $c_{ij} = 0$  )

## lot sizing and tool qualifications

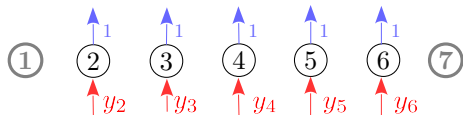
- frequent use of a tool may lower the setup costs (renewals for tool qualifications).
- pharmaceutical, food and semiconductor industry.

violates the triangle inequality (frequent use of a tool may stretch the duration of a qualification)

# lot sizing application - example

find the optimal production quantities

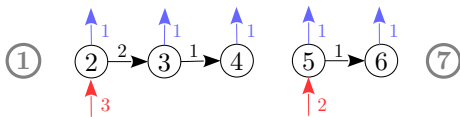
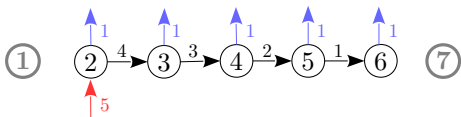
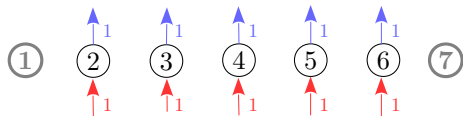
demand  $d_i = 1$  for  $i = \{2, 3, 4, 5, 6\}$



production:  $y_i = ?$  for  $i = \{2, 3, 4, 5, 6\}$

# lot sizing application - example

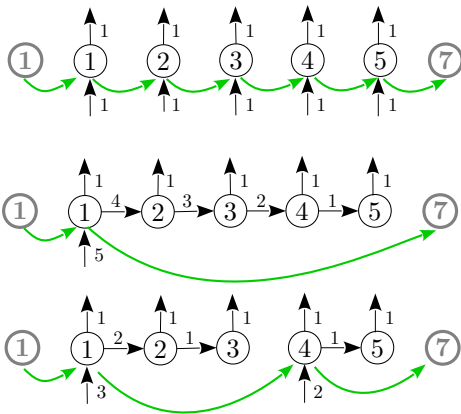
three solutions





# lot sizing application - example

three solutions



## Input data

- periods:  $i \in \{1, \dots, n\}$
- $d_i$ : demand
- $f_i$ : production cost for a given quantity
- $[a_i, b_i]$  interval for feasible production quantities -  $a_i$  may be positive.
- $h_i$  inventory holding cost per unit (storage between end of period  $i$  to start of period  $i + 1$ )
- $c_{ij}$  setup cost
- $t_{ij}$  setup related resource consumption
- $Q_{max}$  is the maximum inventory level
- $T_{max}$  resource consumption limit

## Decision variables

- $x_{ij} = 1$  if  $i$  and  $j$  are periods with production and there is no production in between.
- $y_i$  is the production quantity

auxiliary variable:  $q_i = \sum_{j \leq i} (y_j - d_j)$  is the inventory level after period  $i$

# lotsizing application - MIP

$$\begin{aligned} \min \quad & \sum_{1 \leq i < j \leq n} c_{ij} x_{ij} + \sum_{1 \leq i \leq n} f_i(y_i) + \sum_{1 \leq i \leq n} h_i q_i \\ \text{s.t.} \quad & q_i = \sum_{j \leq i} (y_j - d_j) && 1 \leq i \leq n \\ & \sum_{j < i} x_{ji} = \sum_{j > i} x_{ij} && 1 < i < n \\ & \sum_{j > 1} x_{1j} = 1 \text{ and } \sum_{j < n} x_{jn} = 1 \\ & \sum_{1 \leq i < j \leq n} t_{ij} x_{ij} \leq T_{max} \\ & a_i \sum_{j > i} x_{ij} \leq y_i \leq b_i \sum_{j > i} x_{ij} && 1 \leq i \leq n \\ & 0 \leq q_i \leq Q_{max} && 1 \leq i \leq n \\ & x_{ij} \in \{0, 1\} && 1 \leq i < j \leq n \\ & y_i, q_i \geq 0 && 1 \leq i \leq n \end{aligned}$$

# DP - case without duration constraint

$V_i(q)$  is the minimum cost for inventory level  $q$  considering all customers  $j = 1, 2, \dots, i$  and it is PWL.

## recurrence formula

$$V_0 : \{0\} \mapsto \{0\}, \quad V_0(0) = 0 \quad (10)$$

$$V_i = \min_{j < i} \left( \underbrace{\underbrace{V_j + c_{j,i}}_{\text{shifted value function}} \boxplus f_i}_{\text{superposition}} \right) \quad (11)$$

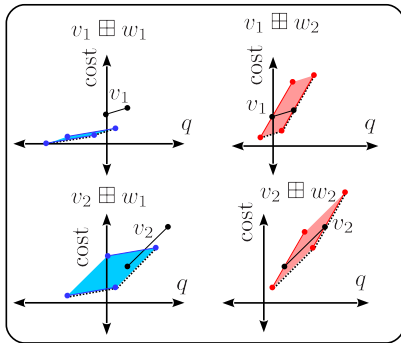
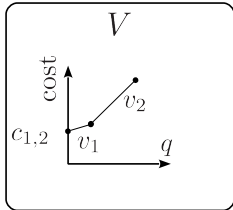
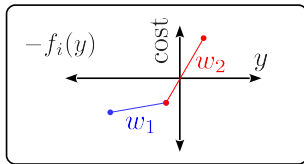
envelope

## superposition

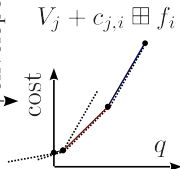
$$(V \boxplus f)(q) = \min_{\substack{y \in \mathcal{D}(f) \\ q-y \in \mathcal{D}(V)}} \{V(q-y) - f(y)\} \quad (12)$$

# superposition - example

$$\underbrace{V_j + c_{j,i}}_V \boxplus f_i :$$



envelope



## recurrence formula - complexity

$$V_0 : \{0\} \mapsto \{0\}, \quad V_0(0) = 0 \quad (13)$$

$$V_i = \min_{j < i} (V_j + c_{j,i}) \boxplus f_i \quad (14)$$

The complexity for calculating stage  $i$  is  $\mathcal{O}(\alpha(M_i) \log(i)M_i)$ , where  $M_i$  is the number of labels of all predecessor value functions.

considering the duration constraint  $\sum_{1 \leq i < j \leq n} t_{ij} x_{ij} \leq T_{max}$

$U_{i,t}(q)$  is the minimum cost for inventory level  $q$  considering all customers  $j = 1, 2, \dots, i$  and a given duration budget  $t$ .

recurrence formula

$$U_{0,0} = 0 \quad (15)$$

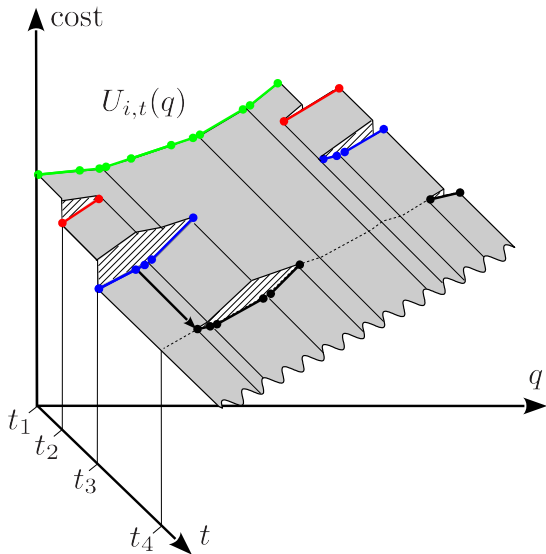
$$U_{i,t} = \min_{j < i, t' + t_{ji} \leq t} (U_{j,t'} + c_{ji}) \boxplus f_i \quad (16)$$

superposition

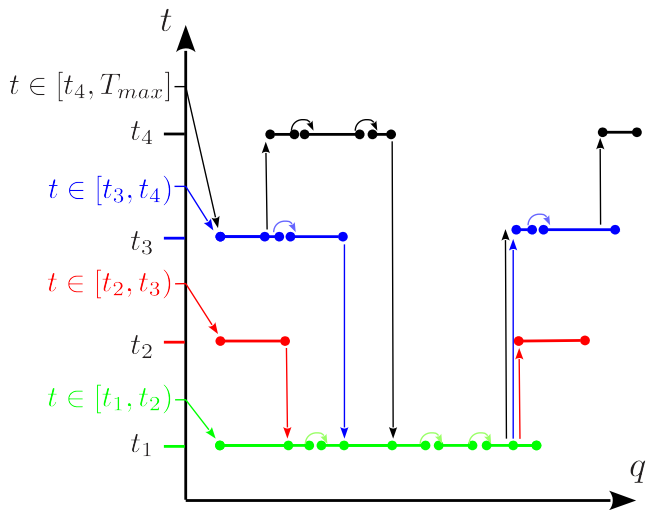
$$(U \boxplus f)(q) = \min_{\substack{y \in \mathcal{D}(f) \\ q-y \in \mathcal{D}(U)}} \{U(q-y) - f(y)\} \quad (17)$$



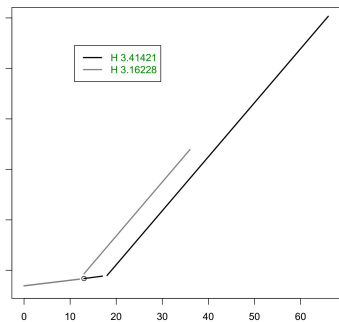
# DP - general case - representation of the value function



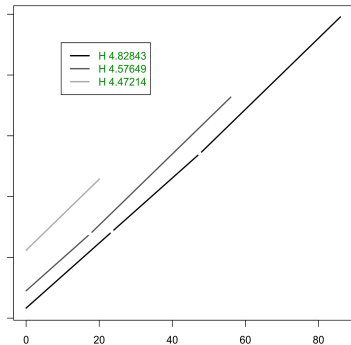
# DP - general case - linked lists



# DP example - complexity I

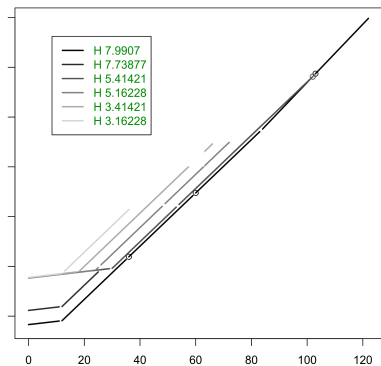


(a) second stage: 5 segments

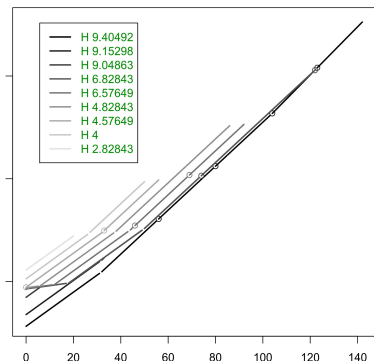


(b) third stage: 6 segments

# DP example - complexity II



(c) fourth stage: 26 segments



(d) fifth stage: 40 segments

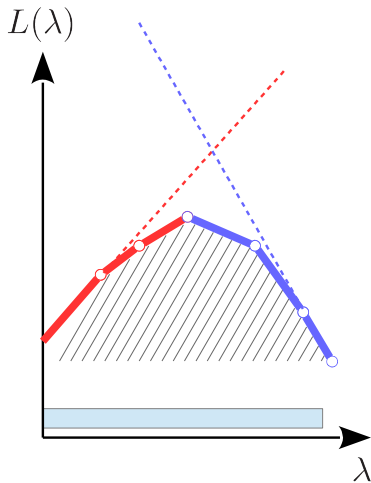
$$L(\lambda) = \min_{x,y: (2-7)} \sum_{1 \leq i < j \leq n} c_{ij}x_{ij} - \sum_{1 \leq i \leq n} f_i(y_i) + \lambda \overbrace{\left( \sum_{1 \leq i < j \leq n} t_{ij}x_{ij} - T_{max} \right)}^{\epsilon(x)}$$

$$L(\lambda^*) = \max_{\lambda \geq 0} L(\lambda)$$

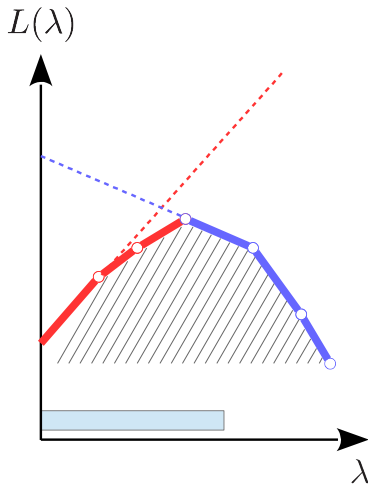
## remarks

- $L(\lambda^*)$  is lower bound for the ARELTP
- calculating  $L(\lambda)$  is equivalent to ARELTP without duration constraint.
- $L(\lambda)$  is concave.
- $L(\lambda^*)$  is associated to a feasible solution of the ARELTP

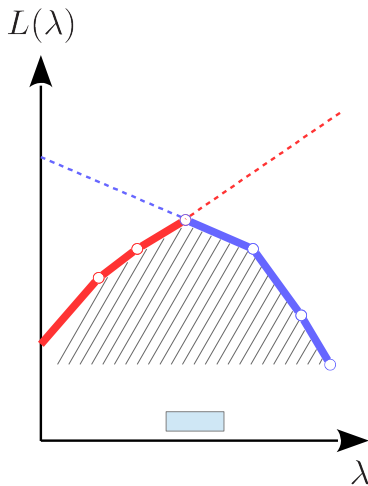
# LR - example



# LR - example

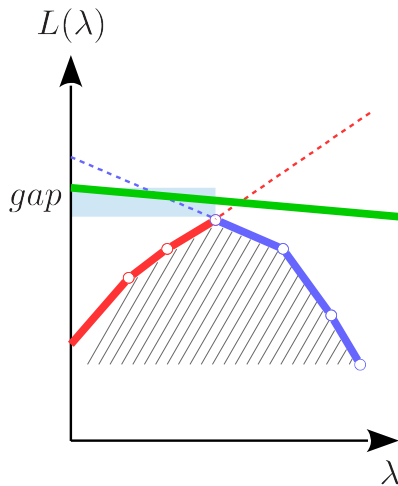


# LR - example





# LR - example



## solution branch

A branch is defined by mandatory customers and forbidden customers.

## branching

a new branch is generated by additionally excluding and including a customer.

## lower bounds

LR provides lower bounds for the branches of the branch & bound tree.

## upper bounds

Heuristic that locally optimizes the feasible dual optimal solution.

select active branch

select the branch with the largest lower bound

branching

customer is randomly selected from a set where the heuristic solution is locally optimal.

## instances

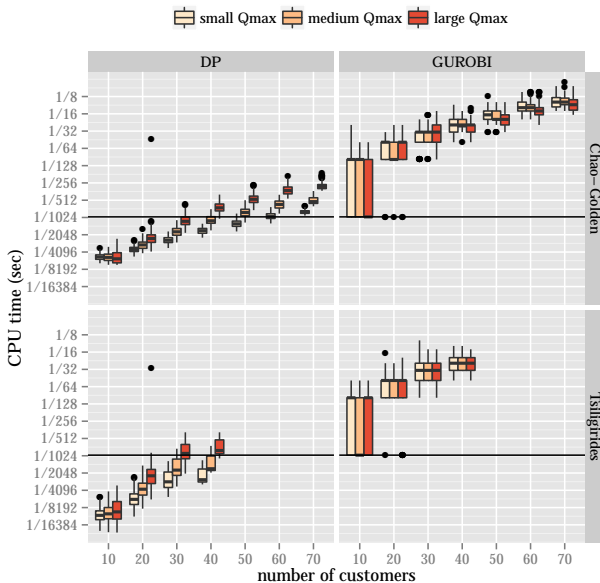
- ARELTP
  - Tisiligrirides (size: 32 locations + PWLP 4 steps)
  - Chao-Golden (size: 64/66 locations + PWLP 4 steps)
  - a-priori routes: 20 per instance.
- lot sizing: new benchmark instances

<http://homepage.univie.ac.at/martin.romauch/ARELTP/>

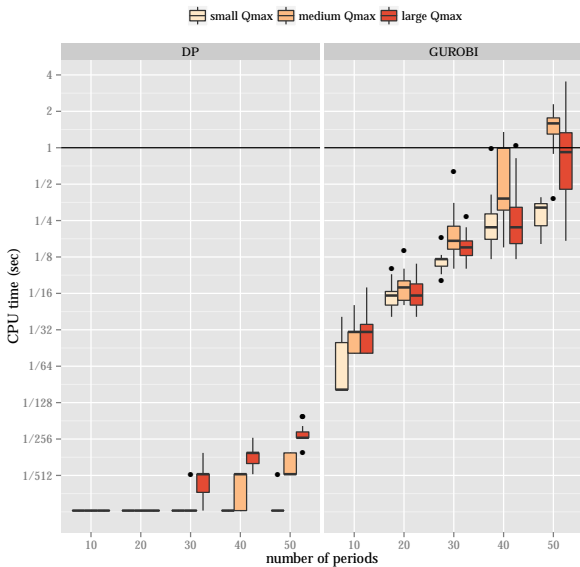
## factors

- number customers / periods ( $n$ )
- duration limit / maximum resource consumption ( $T_{max}$ )
- load capacity / maximum inventory level ( $Q_{max}$ )

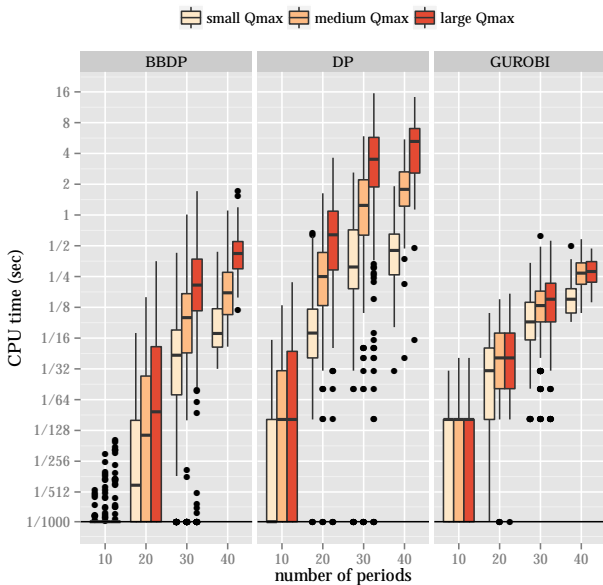
# Results: Tsiglirides and Chao-Golden ( $T_{max} = \infty$ )



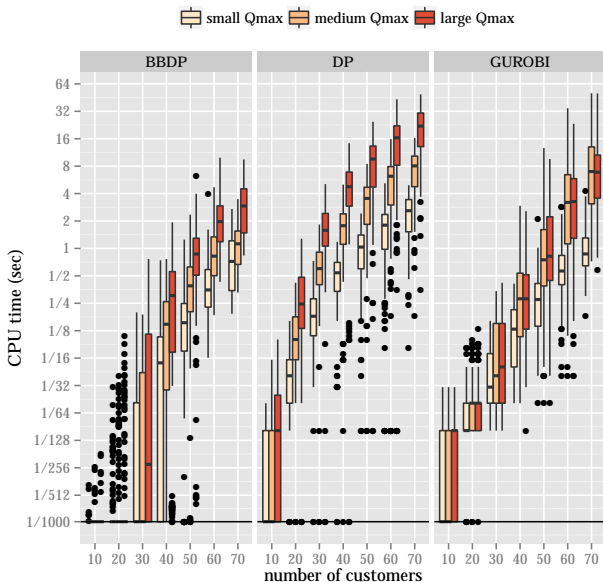
# Results: lot sizing ( $T_{max} = \infty$ )



# Results: Tsilgirides

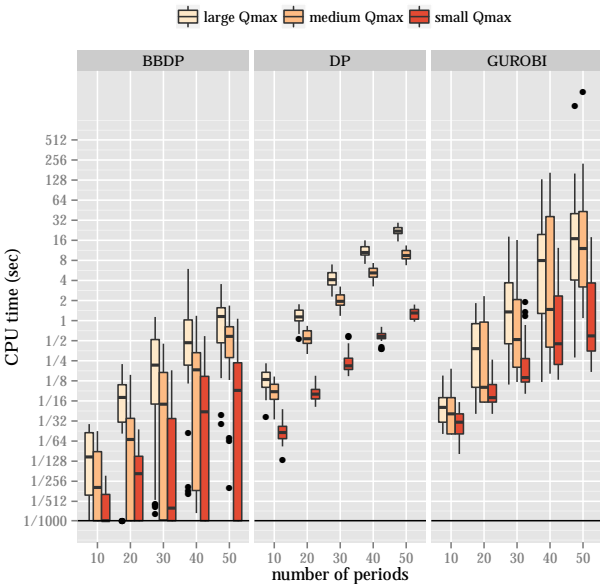


# Results: Chao-Golden





# Results: lot sizing



## Conclusion

- With respect to the computational experiments, the presented B&B approach has in average the best performance.
- Very large load capacities  $Q_{max}$  are beneficial for Gurobi
- Very large duration limits  $T_{max}$  are beneficial for the proposed B&B
- Very good results for the lot sizing instances

## next steps

- integration of the ARELTP solver into a framework to solve lateral transshipment for PWLP.
- application: stochastic demands
- extension: more than one route/product, split deliveries ...



Richard F Hartl and Martin Romauch.

The influence of routing on lateral transshipment.

In *Computer Aided Systems Theory-EUROCAST 2013*,  
pages 267–275. Springer, 2013.