

Min-Max vs. Min-Sum Vehicle Routing: A Worst-Case Analysis

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Introduction

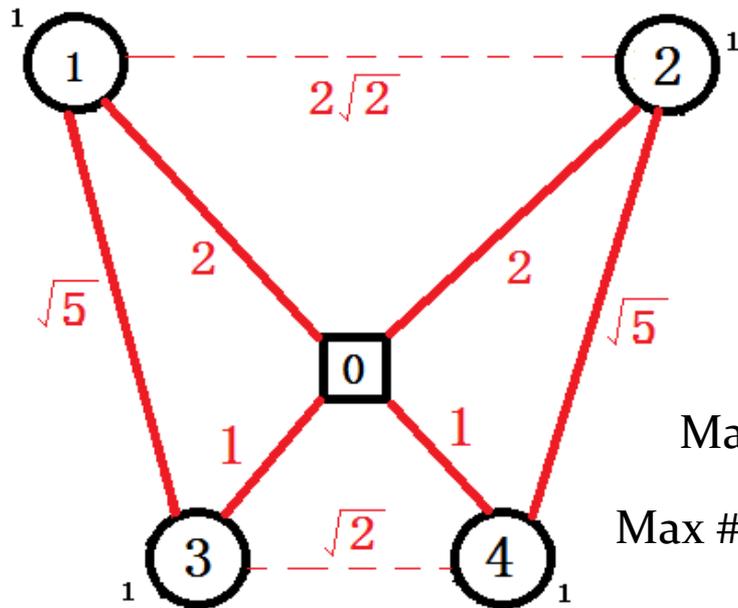
- In the min-sum VRP, the objective is to minimize the total cost incurred over all the routes
- In the min-max VRP, the objective is to minimize the maximum cost incurred by any one of the routes
- Suppose we have computer code that solves the min-sum VRP, how poorly can it do on the min-max VRP?
- Suppose we have computer code that solves the min-max VRP, how poorly can it do on the min-sum VRP?

Introduction

- Applications of the min-max objective
 - Disaster relief efforts
 - Serve all victims as soon as possible
 - Computer networks
 - Minimize maximum latency between a server and a client
 - Workload balance
 - Balance amount of work among drivers and/or across a time horizon

An Instance of the VRP

The min-max solution



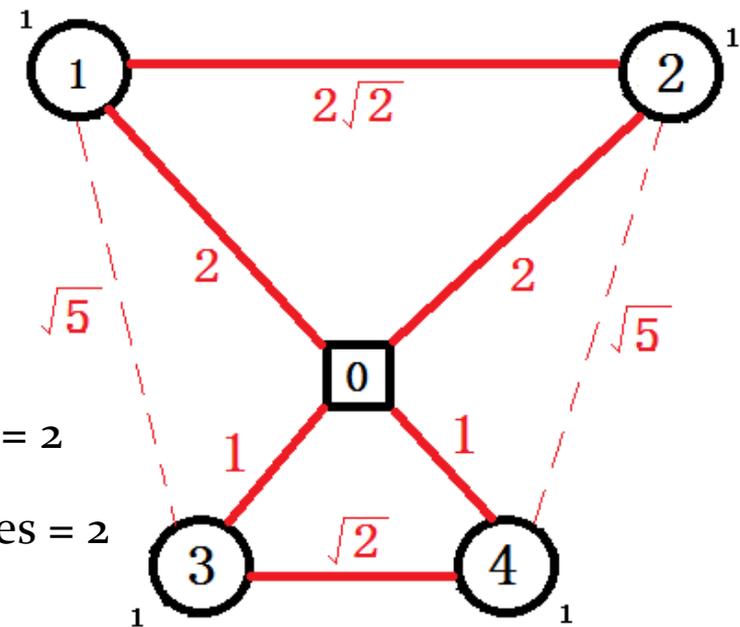
Max load = 2

Max # vehicles = 2

total cost = $6 + 2\sqrt{5} \approx 10.47$

min-max cost = $3 + \sqrt{5} \approx 5.24$

The min-sum solution



total cost = $6 + 3\sqrt{2} \approx 10.24$

min-max cost = $4 + 2\sqrt{2} \approx 6.83$

Motivation behind our Worst-Case Study

- Observation: The min-max solution has a slightly higher (2.2%) total cost, but it has a much smaller (23.3%) min-max cost
 - Also, the routes are better balanced
- Is this always the case?
- What is the worst-case ratio of the cost of the longest route in the min-sum VRP to the cost of the longest route in the min-max VRP?
- What is the worst-case ratio of the total cost of the min-max VRP to the total cost of the min-sum VRP?

Variants of the VRP Studied

- Capacitated VRP with infinitely many vehicles (CVRP_INF)
- Capacitated VRP with a finite number of vehicles (CVRP_k)
- Multiple TSP (MTSP_k)
- Service time VRP with a finite number of vehicles (SVRP_k)

CVRP_INF

- Capacitated VRP with an infinite number of vehicles

- r_{MM}^{∞} : the cost of the longest route of the optimal min-max solution

- r_{MS}^{∞} : the cost of the longest route of the optimal min-sum solution

- z_{MM}^{∞} : the total cost of the optimal min-max solution

- z_{MS}^{∞} : the total cost of the optimal min-sum solution

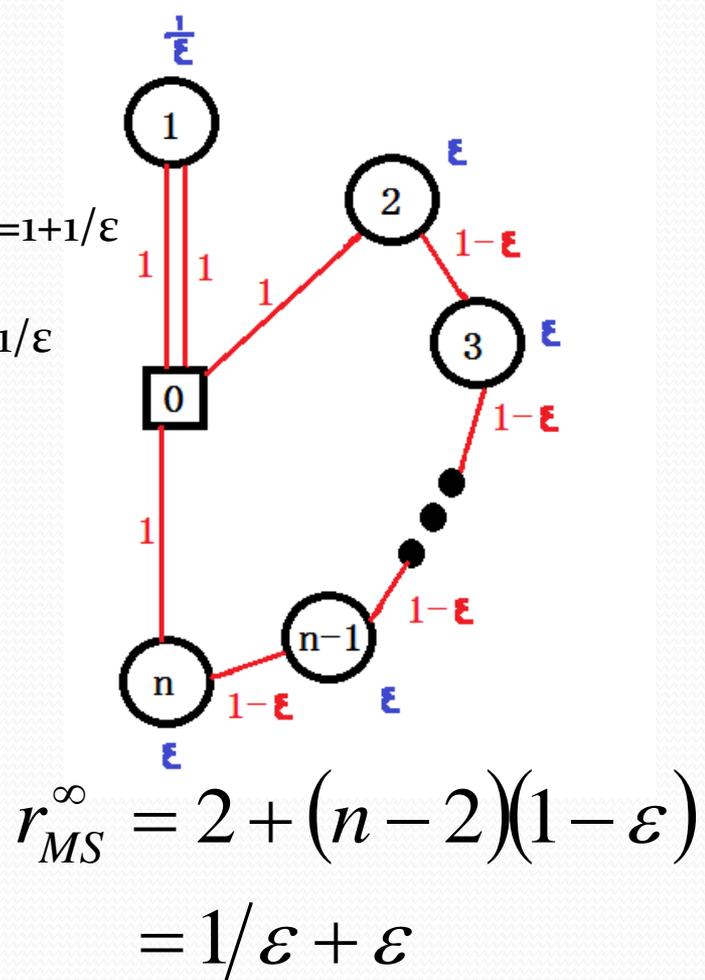
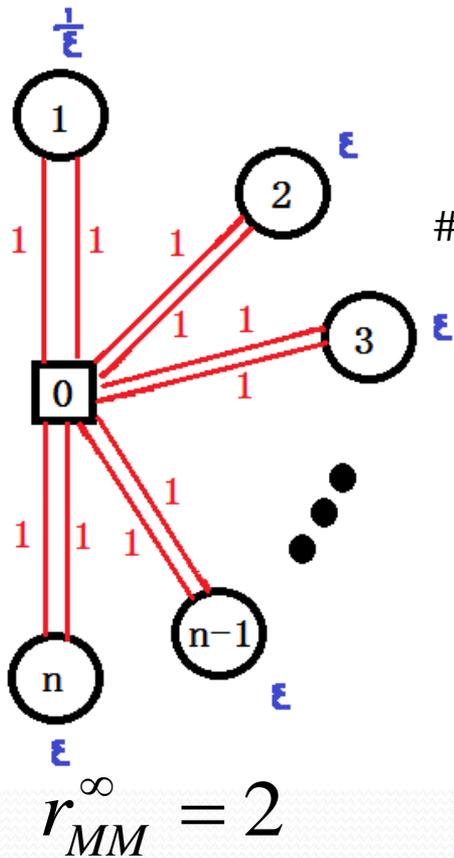
- The superscript denotes the variant

A Preview of Things to Come

- For each variant, we present worst-case bounds
- In addition, we show instances that demonstrate that the worst-case bounds are tight

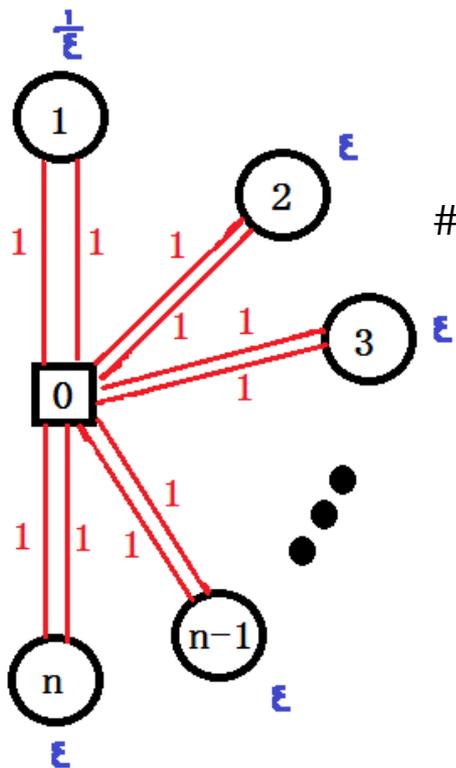
CVRP_INF

$$r_{MS}^{\infty} / r_{MM}^{\infty} \rightarrow \infty$$



CVRP_INF

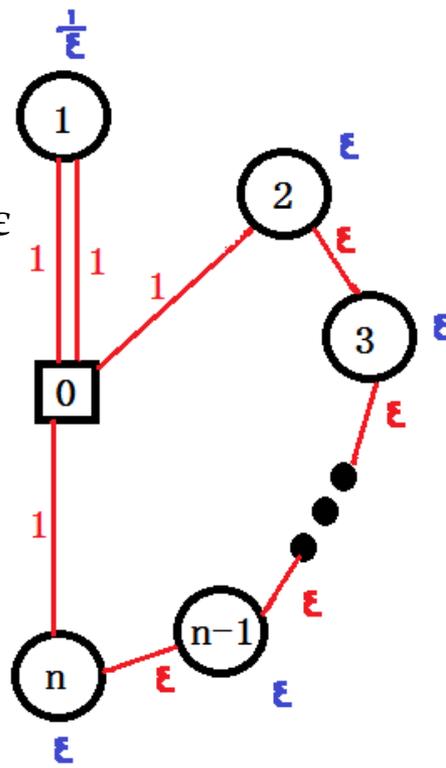
$$z_{MM}^{\infty} / z_{MS}^{\infty} \rightarrow \infty$$



customers: $n = 1 + 1/\epsilon$

capacity = $1/\epsilon$

$$z_{MM}^{\infty} = 2(1 + 1/\epsilon)$$



$$\begin{aligned} z_{MS}^{\infty} &= 4 + (n - 2)\epsilon \\ &= 5 - \epsilon \end{aligned}$$

CVRP_k

- Capacitated VRP with at most k vehicles available

- $r_{MS}^{(k)} \leq z_{MS}^{(k)} \leq z_{MM}^{(k)} \leq kr_{MM}^{(k)}$

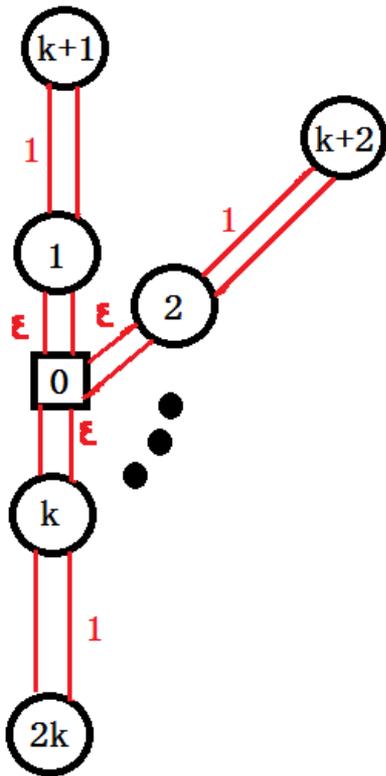
$$\Rightarrow r_{MS}^{(k)} / r_{MM}^{(k)} \leq k$$

- $z_{MM}^{(k)} \leq kr_{MM}^{(k)} \leq kr_{MS}^{(k)} \leq kz_{MS}^{(k)}$

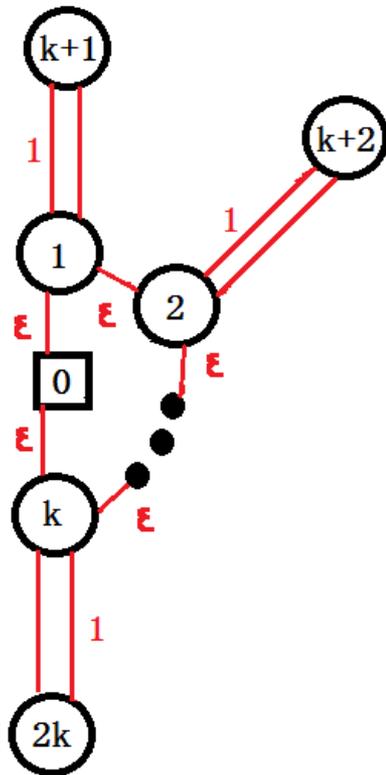
$$\Rightarrow z_{MM}^{(k)} / z_{MS}^{(k)} \leq k$$

CVRP_k

$$r_{MS}^{(k)} / r_{MM}^{(k)} \leq k$$



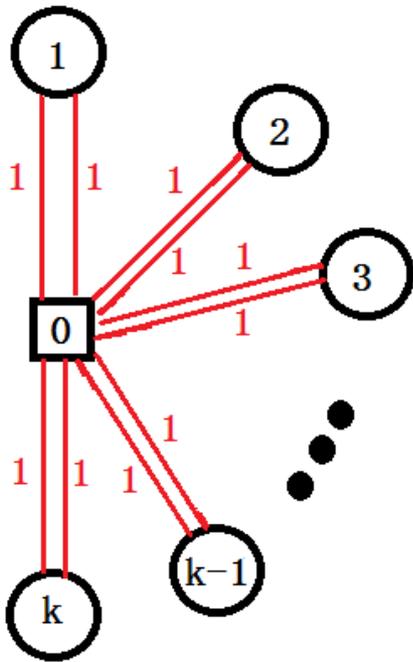
$$r_{MM}^{(k)} = 2 + 2\epsilon$$



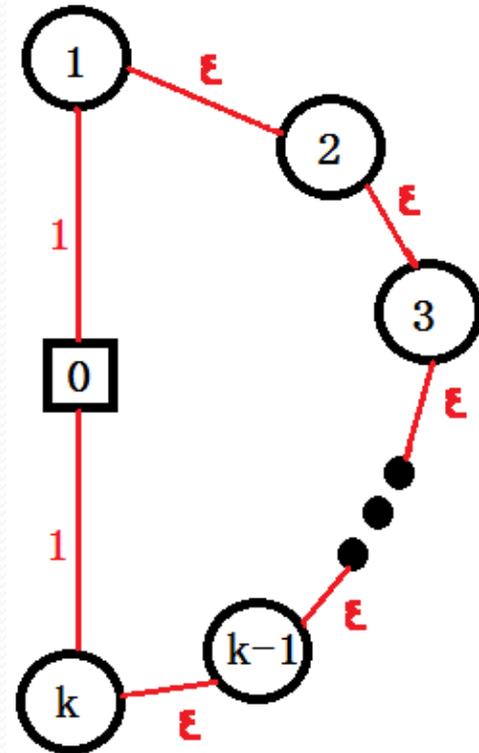
$$r_{MS}^{(k)} = 2k + (k + 1)\epsilon$$

CVRP_k

$$z_{MM}^{(k)} / z_{MS}^{(k)} \leq k$$



$$z_{MM}^{(k)} = 2k$$



$$z_{MS}^{(k)} = 2 + (k-1)\epsilon$$

MTSP_k

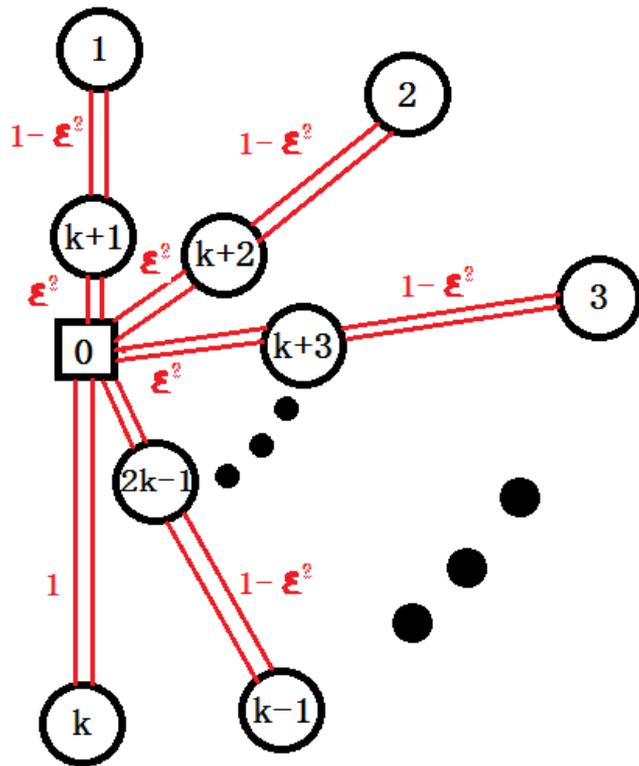
- Multiple TSP with k vehicles
 - The customers just have to be visited
 - Exactly k routes have to be defined

- $$r_{MS}^{(M)} \leq z_{MS}^{(M)} \leq z_{MM}^{(M)} \leq kr_{MM}^{(M)} \implies r_{MS}^{(M)} / r_{MM}^{(M)} \leq k$$

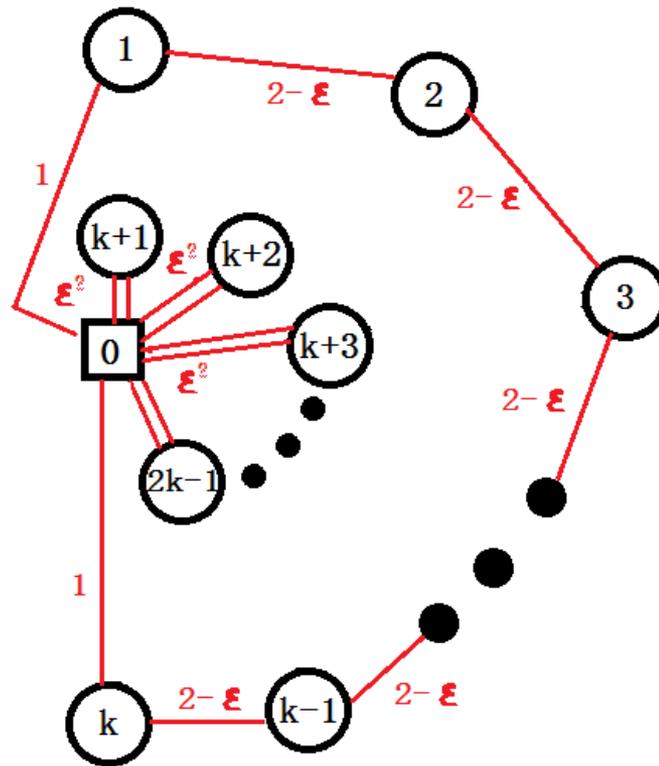
- $$z_{MM}^{(M)} \leq kr_{MM}^{(M)} \leq kr_{MS}^{(M)} \leq kz_{MS}^{(M)} \implies z_{MM}^{(M)} / z_{MS}^{(M)} \leq k$$

MTSP_k

$$r_{MS}^{(M)} / r_{MM}^{(M)} \leq k$$



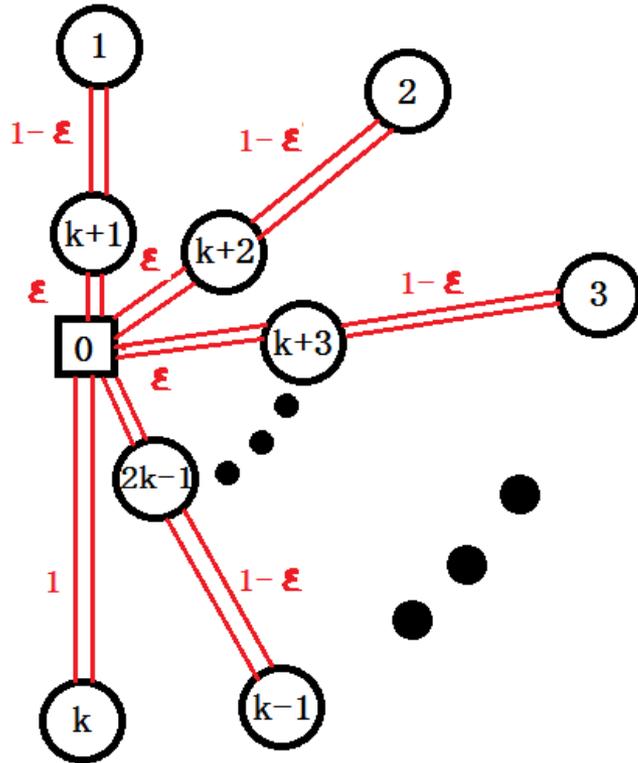
$$r_{MM}^{(M)} = 2$$



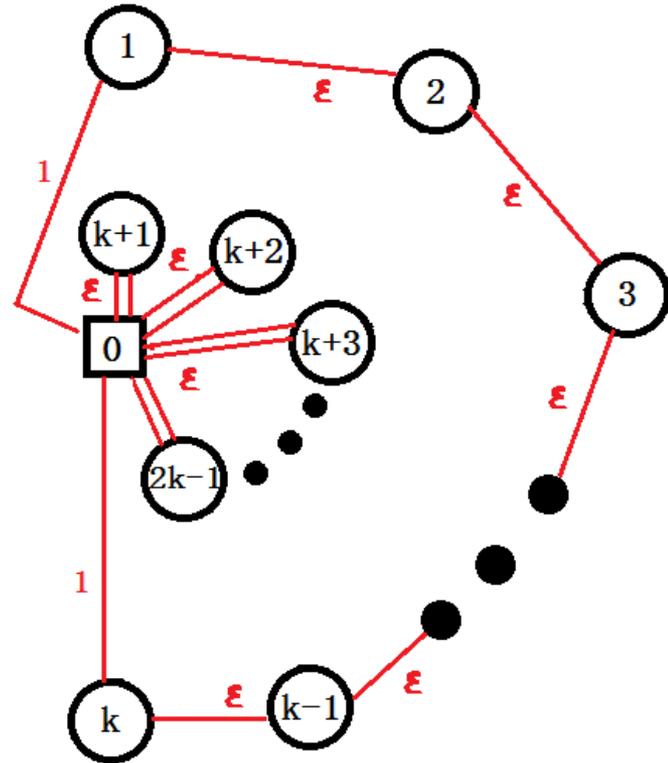
$$\begin{aligned} r_{MS}^{(M)} &= 2 + (k-1)(2-\varepsilon) \\ &= 2k - (k-1)\varepsilon \end{aligned}$$

MTSP_k

$$z_{MM}^{(M)} / z_{MS}^{(M)} \leq k$$



$$z_{MM}^{(M)} = 2k$$



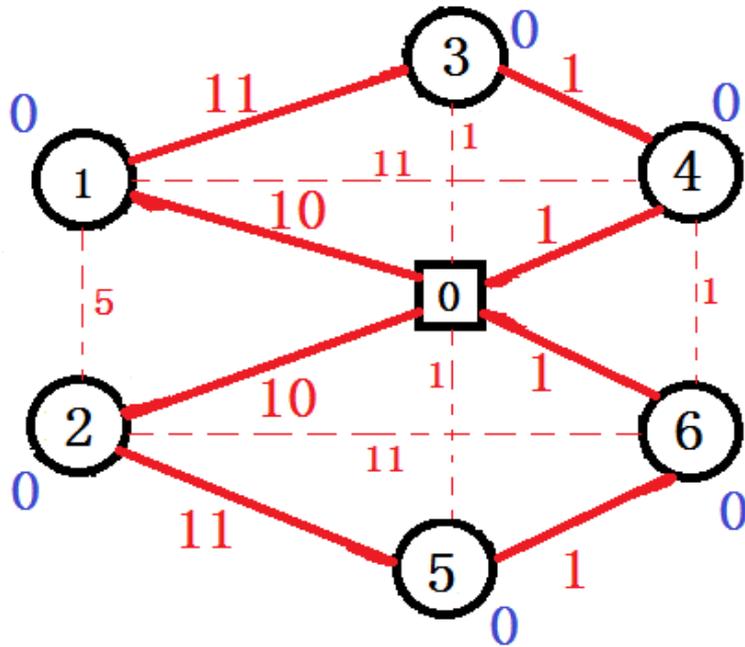
$$\begin{aligned} z_{MS}^{(M)} &= 2 + 2(k-1)\varepsilon + (k-1)\varepsilon \\ &= 2 + 3\varepsilon(k-1) \end{aligned}$$

SVRP_k

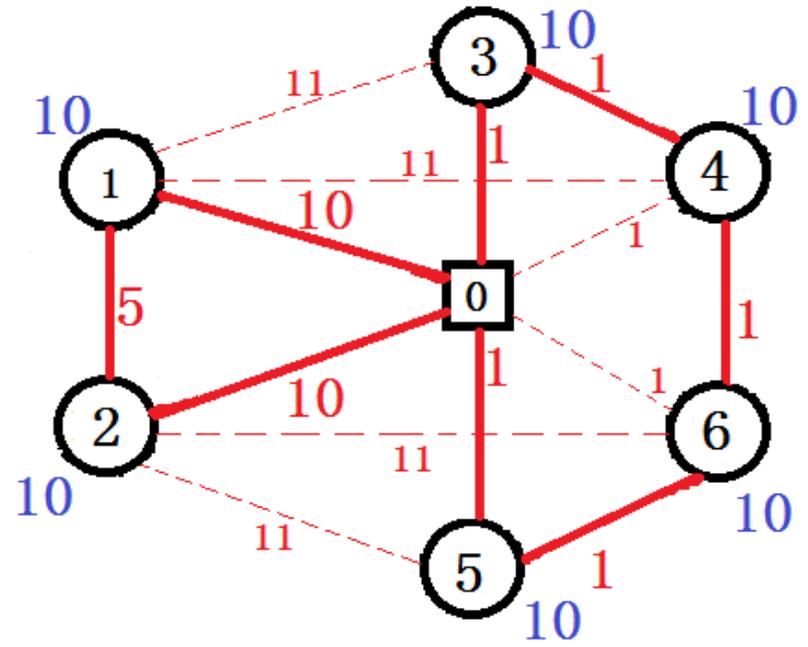
- Service time VRP with at most k vehicles
 - Customer demands are given in terms of service times
 - Cost of a route = travel time + service time
- Routing of the min-sum solution is not affected by service times
- Routing of the min-max solution may be affected by service times
- $r_{MS}^{(s)} \leq z_{MS}^{(s)} \leq z_{MM}^{(s)} \leq k r_{MM}^{(s)} \implies r_{MS}^{(s)} / r_{MM}^{(s)} \leq k$

SVRP_k

Min-max solution without service times

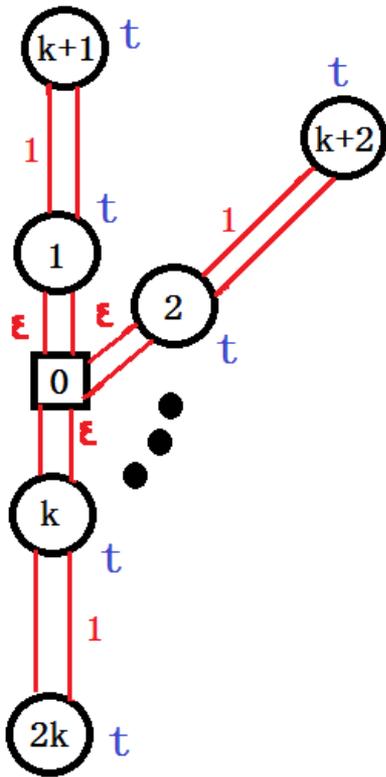


Min-max solution with service times

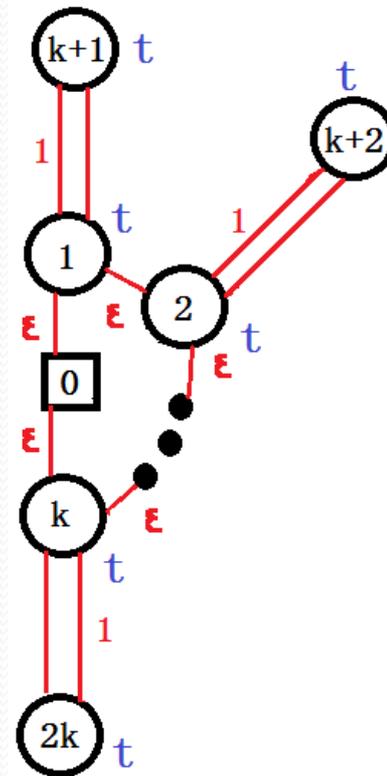


SVRP_k

$$r_{MS}^{(S)} / r_{MM}^{(S)} \leq k$$



$$r_{MM}^{(S)} = 2 + 2t + 2\varepsilon$$



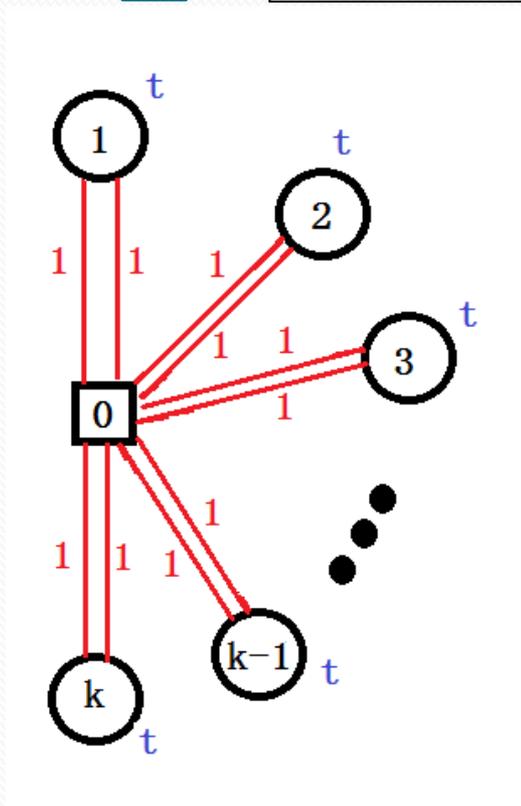
$$r_{MS}^{(S)} = 2k + 2kt + (k + 1)\varepsilon$$

SVRP_k

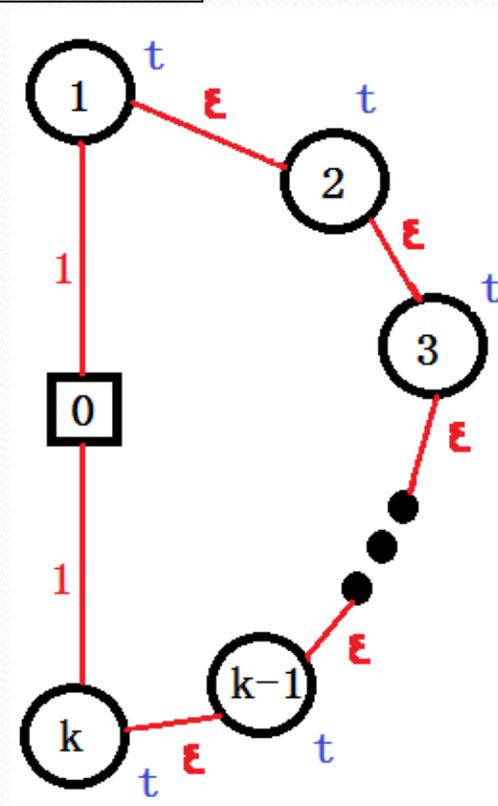
- The bound $z_{MM}^{(s)} \leq kr_{MM}^{(s)} \leq kr_{MS}^{(s)} \leq kz_{MS}^{(s)} \implies z_{MM}^{(s)} / z_{MS}^{(s)} \leq k$ is still valid, but no longer tight
- We prove the tight bound
$$z_{MM}^{(s)} \leq kz_{MS}^{(s)} - (k-1)T, \text{ where } T = \text{total service time}$$
in our paper

SVRP_k

$$z_{MM}^{(S)} \leq kz_{MS}^{(S)} - (k-1)T$$



$$z_{MM}^{(S)} = 2k + T$$



$$z_{MS}^{(S)} = 2 + \varepsilon(k-1) + T$$

A Summary

	Ratio of the cost of the longest route	Ratio of the total cost
CVRP_INF	$r_{MS}^{\infty} / r_{MM}^{\infty} \rightarrow \infty$	$z_{MM}^{\infty} / z_{MS}^{\infty} \rightarrow \infty$
CVRP_k	$z_{MM}^{(k)} / z_{MS}^{(k)} \leq k$	$z_{MM}^{(k)} / z_{MS}^{(k)} \leq k$
MTSP_k	$r_{MS}^{(M)} / r_{MM}^{(M)} \leq k$	$z_{MM}^{(M)} / z_{MS}^{(M)} \leq k$
SVRP_k	$r_{MS}^{(S)} / r_{MM}^{(S)} \leq k$	$z_{MM}^{(S)} \leq kz_{MS}^{(S)} - (k-1)T$

Conclusions

- If your true objective is min-max, don't use the min-sum solution
- If your true objective is min-sum, don't use the min-max solution