

DM811
Heuristics for Combinatorial Optimization

Lecture 5 Construction Heuristics, TSP and SAT

Marco Chiarandini

Department of Mathematics & Computer Science
University of Southern Denmark

1. Exercises

Heuristics for TSP
Heuristics for GCP

2

Recap

Outline
Exercises

- Combinatorial Optimization and Terminology
- Basic Concepts in Algorithmics
Graphs • Notation and runtime • Machine model • Pseudo-code • Computational Complexity • Analysis of Algorithms
- Construction Heuristics + Local Search + Metaheuristics
- Software systems and Working Environment
[Comet, EasyLocal++, unix]
- Assignment 1 + Analysis of Results in R
[RStudio, Cheat Sheet, My Notes, script]
- Construction Heuristics (search tree, variable + value model)
[from complete (DFS, Best first, A*) to incomplete search (greedy)]
- Metaheuristics on CH

3

Outline

Outline
Exercises

1. Exercises

Heuristics for TSP
Heuristics for GCP

4

Construction heuristics specific for TSP

- Heuristics that Grow Fragments
 - Nearest neighborhood heuristics
 - Double-Ended Nearest Neighbor heuristic
 - Multiple Fragment heuristic (aka, greedy heuristic)
- Heuristics that Grow Tours

<ul style="list-style-type: none"> ● Nearest Addition ● Farthest Addition ● Random Addition ● Clarke-Wright savings heuristic 	<ul style="list-style-type: none"> ● Nearest Insertion ● Farthest Insertion ● Random Insertion
---	---
- Heuristics based on Trees
 - Minimum spanning tree heuristic
 - Christofides' heuristics
 - Fast recursive partitioning heuristic

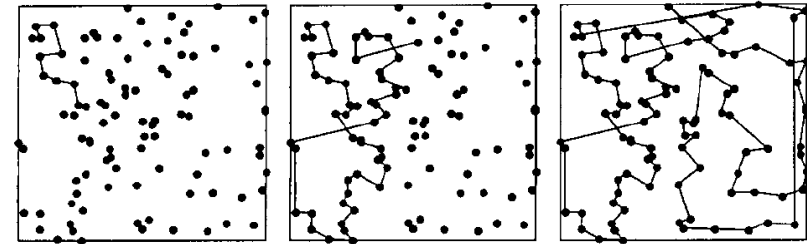


Figure 1. The Nearest Neighbor heuristic.

6

7

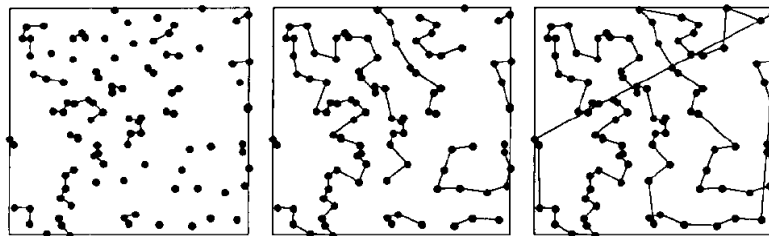


Figure 5. The Multiple Fragment heuristic.

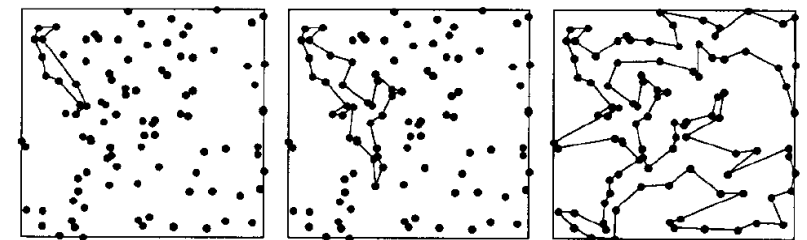


Figure 8. The Nearest Addition heuristic.

8

9

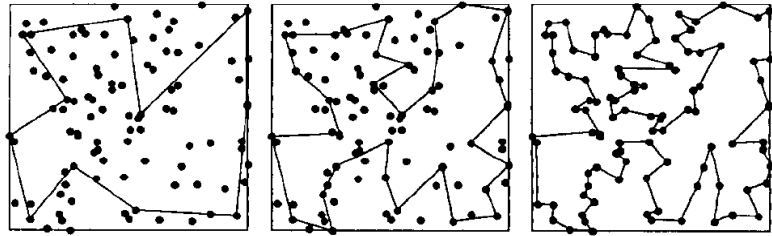


Figure 11. The Farthest Addition heuristic.

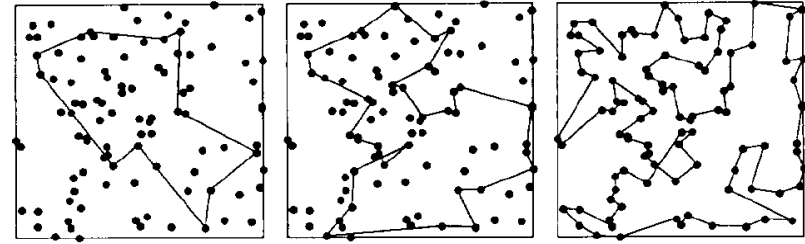


Figure 14. The Random Addition heuristic.

10

11

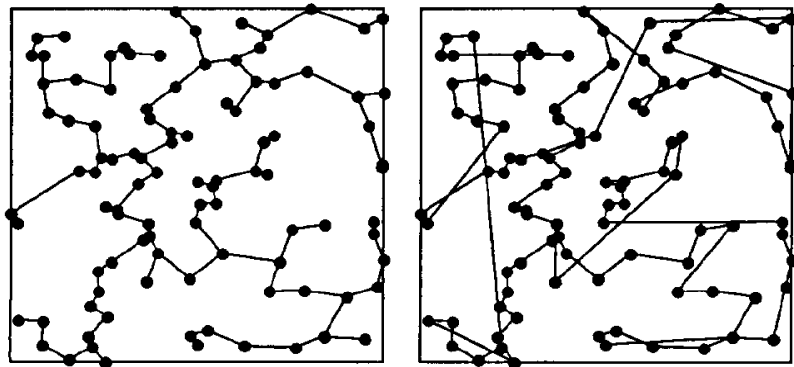


Figure 18. The Minimum Spanning Tree heuristic.

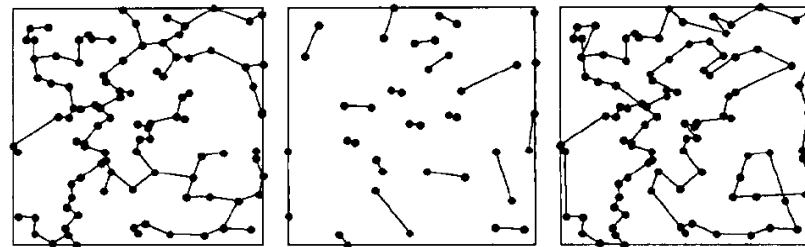


Figure 19. Christofides' heuristic.

12

13

- sequential heuristics
 1. choose a **variable** (vertex)
 - a) static order: random (ROS),
largest degree first, smallest degree last
 - b) dynamic order: saturation degree (DSATUR) [?]
 2. choose a **value** (color): greedy heuristic

```

Procedure ROS
RandomPermutation  $\pi$ (Vertices);
forall  $i$  in  $1, \dots, n$  do
     $v := \pi(i)$ ;
    select min{ $c : c$  not in saturated[ $v$ ]};
    col[ $v$ ] :=  $c$ ;
    add  $c$  in saturated[ $w$ ] for all  $w$  adjacent  $v$ ;
    
```

$$O(nk + m) \rightsquigarrow O(n^2)$$

```

Procedure DSATUR
select vertex  $v$  uncolored with max degree;
while uncolored vertices do
    select min{ $c : c$  not in saturated[ $v$ ]};
    col[ $v$ ] :=  $c$ ;
    add  $c$  in saturated[ $w$ ] for all  $w$  adjacent  $v$ ;
    select uncolored  $v$  with max size of saturated[ $v$ ];
    
```

$$O(n(n + k) + m) \rightsquigarrow O(n^2)$$

- partitioning heuristics
 - recursive largest first (RLF) [?]
iteratively extract stable sets

Alternative form of pseudo-code

```

Procedure ROS
RandomPermutation  $\pi$ (Vertices);
forall  $i$  in  $1, \dots, n$  do
     $v := \pi(i)$ ;
    selectMin { $c : c$  not in saturated[ $v$ ]};
    col[ $v$ ] :=  $c$ ;
    forall  $w$  in Vertices: adj[ $v, w$ ] do
        saturated[ $w$ ].insert( $c$ );
    
```

```

Procedure DSATUR
RandomPermutation  $\pi$ (Vertices);
forall  $i$  in  $1, \dots, n$  do
     $v := \pi(i)$ ;
    selectMin { $c : c$  not in saturated[ $v$ ]};
    col[ $v$ ] :=  $c$ ;
    forall  $w$  in Vertices: adj[ $v, w$ ] do
        saturated[ $w$ ].insert( $c$ );
    
```

RLF [?]

RLF

Key idea: extract stable sets trying to maximize edges removed.

```

Procedure Recursive Largest First( $G$ )
In  $G = (V, E)$  : input graph;
Out  $k$  : upper bound on  $\chi(G)$ ;
Out  $c$  : a coloring  $c : V \rightarrow K$  of  $G$ ;

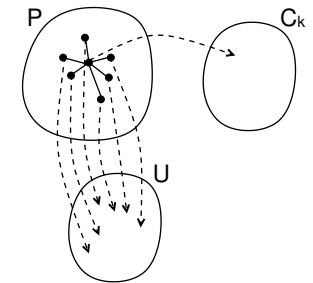
 $k \leftarrow 0$  while  $|V| > 0$  do
     $k \leftarrow k + 1$ 
    FindStableSet( $V, E, k$ )
return  $k$ 
    
```

/* Use an additional color */
/* $G = (V, E)$ is reduced */

```

Procedure FindStableSet( $G, k$ )
In  $G = (V, E)$  : input graph
In  $k$  : color for current stable set
Var  $P$  : set of potential vertices for stable set
Var  $U$  : set of vertices that cannot go in current stable set

 $P \leftarrow V$ ;  $U \leftarrow \emptyset$ ;
forall  $v \in P$  do  $d_U(v) \leftarrow 0$ ; /* degree induced by  $U$  */
while  $P$  not empty do
    select  $v$  in  $P$  with max  $d_U$ ;
    move  $v$  from  $P$  to  $C_k$ ;  $V \leftarrow V \setminus \{v\}$ 
    forall  $w \in \delta_P(v)$  do /* neighbors of  $v$  in  $P$  */
        move  $w$  from  $P$  to  $U$ ;  $E \leftarrow E \setminus \{v, w\}$ 
        forall  $u \in \delta_P(w)$  do
             $d_U(u) \leftarrow d_U(u) + 1$ 
    
```



$$O(m + n\Delta^2) \rightsquigarrow O(n^3)$$