

DM841

Discrete Optimization

**Vehicle Routing**  
**Local Search based Metaheuristics**

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## 1. Improvement Heuristics

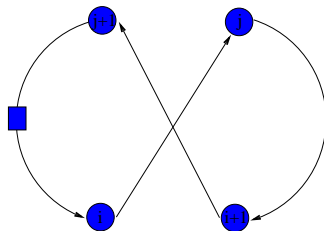
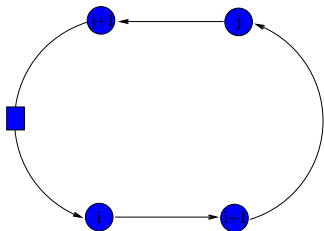
1. Improvement Heuristics

- ▶ Neighborhood structures:
  - ▶ Intra-route: 2-opt, 3-opt, Lin-Kernighan (not very well suited), Or-opt (2H-opt)
  - ▶ Inter-routes:  $\lambda$ -interchange, relocate, exchange, cross, 2-opt\*,  $b$ -cyclic  $k$ -transfer (ejection chains), GENI
- ▶ Solution representation and data structures
  - ▶ They depend on the neighborhood.
  - ▶ It can be advantageous to change them from one stage to another of the heuristic

# Intra-route Neighborhoods

2-opt

$$\{i, i+1\}\{j, j+1\} \longrightarrow \{i, j\}\{i+1, j+1\}$$

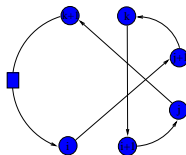
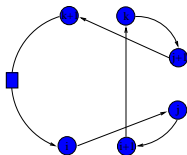
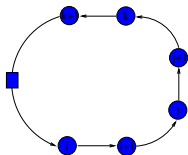


$O(n^2)$  possible exchanges  
One path is reversed

# Intra-route Neighborhoods

3-opt

$$\{i, i + 1\}\{j, j + 1\}\{k, k + 1\} \rightarrow \dots$$

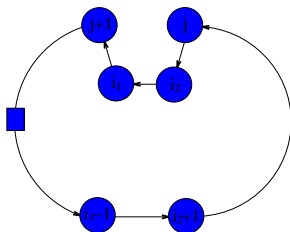
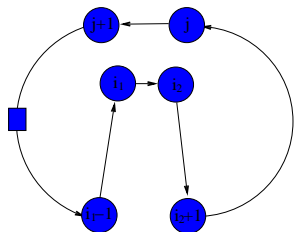


$O(n^3)$  possible exchanges  
Paths can be reversed

# Intra-route Neighborhoods

Or-opt [Or (1976)]

$$\{i_1 - 1, i_1\}\{i_2, i_2 + 1\}\{j, j + 1\} \longrightarrow \{i_1 - 1, i_2 + 1\}\{j, i_1\}\{i_2, j + 1\}$$



sequences of one, two, three consecutive vertices relocated  
 $O(n^2)$  possible exchanges — No paths reversed

# Inter-route Neighborhoods

[Savelsbergh, ORSA (1992)]



Figure 6. The exchange neighborhood.



# Inter-route Neighborhoods

[Savelsbergh, ORSA (1992)]

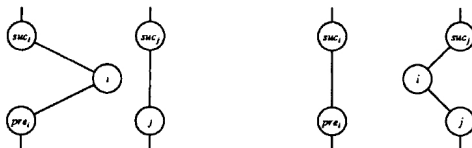


Figure 5. The relocate neighborhood.

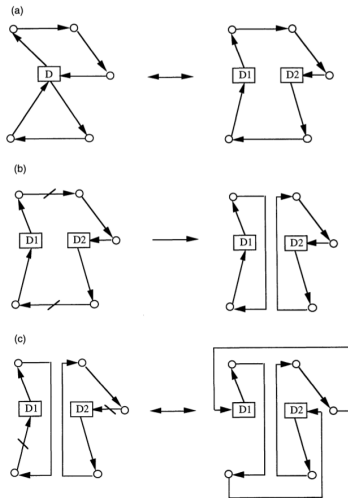
# Inter-route Neighborhoods

[Savelsbergh, ORSA (1992)]



Figure 7. The cross neighborhood.

Exchanges 2 pairs of edges between routes.  
 First transform in TSP by creating  $M$  depots



$O(n^2)$  possible moves. (4 edges introduced but 2 are fixed given the other 2)

Preserve orientation and introduce last part of a route on another route.

[Potvin, J.-M. Rousseau,  
 An exchange heuristic for routing  
 problems with time windows  
 Journal of the Operational Research  
 Society, 46 (1995), pp. 1433-1446]

## GENI: generalized insertion

[Gendreau, Hertz, Laporte, Oper. Res. (1992)]

- ▶ select the insertion restricted to the neighborhood of the vertex to be added (not necessarily between consecutive vertices)
- ▶ perform the best 3- or 4-opt restricted to reconnecting arc links that are close to one another.

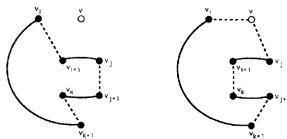


Figure 1. Type I insertion of vertex  $v$  between  $v_i$  and  $v_j$ .

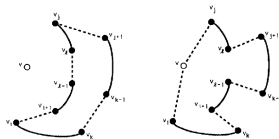


Figure 2. Type II insertion of vertex  $v$  between  $v_i$  and  $v_j$ .

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**Algorithm 1** Local Improvement( $s_{\text{CURR}}$ )

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1: isEnd = false
2: for each route  $r \in s_{\text{CURR}}$  do updateData( $r$ )
3: while not isEnd do
4:   isEnd = true
5:   for  $i = 1, \dots, n$  and  $j = 1, \dots, n$  do
6:      $c_i \leftarrow$  shuffledNodeOrder( $i$ ) ;  $c_j \leftarrow$  shuffledNodeOrder( $j$ ) ;
7:      $r_i \leftarrow$  getRoute( $c_i$ ) ;  $r_j \leftarrow$  getRoute( $c_j$ ) ;
8:     if  $r_i \neq r_j$  and {isImprovingCROSS( $c_i, c_j$ ) or isImproving2opt*( $c_i, c_j$ )} then
9:        $s_{\text{CURR}} \leftarrow$  performMove( $s_{\text{CURR}}; c_i, c_j$ ) ; updateData( $r_i, r_j$ ) ; isEnd = false
10:    if  $r_i == r_j$  and {isImprovingOrOpt( $c_i, c_j$ ) or isImproving2Opt( $c_i, c_j$ )} then
11:       $s_{\text{CURR}} \leftarrow$  performMove( $s_{\text{CURR}}; c_i$ ) ; updateData( $r_i$ ) ; isEnd = false;
12: return  $s_{\text{CURR}}$ 
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