



# Variable Neighborhood Search

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# CONTENTS



Introduction



Details of VNS



Advantages and disadvantages



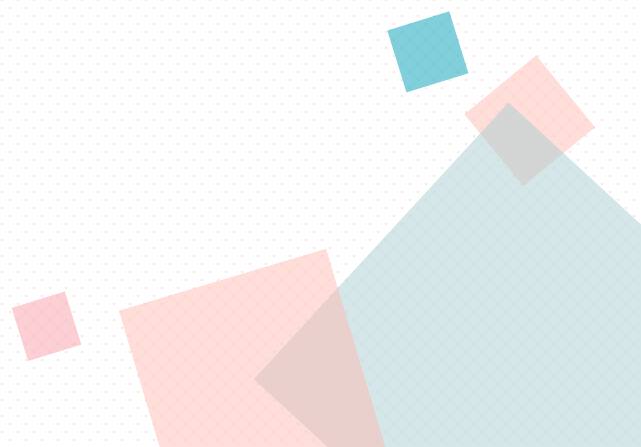
PART

# Introduction



# Variable Neighborhood Search

Variable Neighborhood Search(VNS): A recent **metaheuristic** for solving combinatorial and global optimization problems whose basic idea is **systematic change of neighborhood** within a local search.

- Traveling Salesman Problem
  - Vehicle Routing Problem
  - Location and Clustering Problems
  - Graphs and Networks
  - Scheduling
- 



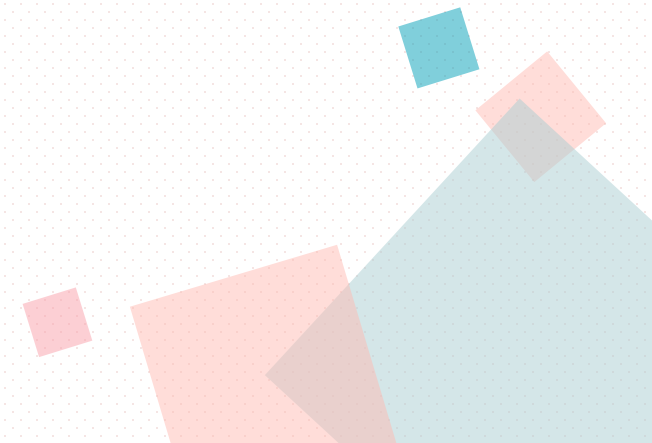
# Variable Neighborhood Search

Algorithm

Algorithm

Variable Neighborhood Search(VNS) is based on three simple facts:

- A local minimum w.r.t. one neighborhood structure is not necessary so with another.
- A global minimum is a local minimum w.r.t. all possible neighborhood structures.
- For many problems local minima w.r.t. one or several are relatively close to each other.





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## Details of VNS

# Details of VNS

VNS includes:

- variable neighborhood descent (VND)
- shaking procedure
- Neighborhood: A neighborhood is the set of all the solutions that can be obtained by performing an operation on the current solution
- Neighborhood Action: It is a function that produces a set of neighbor solutions for the current solution  $s$ .

$S = 1001$        $\longrightarrow$        $N(s) = \{0001, 1101, 1011, 1000\}$

# VND

Initialization. Select the set of neighborhood structures  $\mathcal{N}_k$ , for  $k = 1, \dots, k_{\max}$ , that will be used in the search; find an initial solution  $x$ ; choose a stopping condition;

Repeat the following sequence until the stopping condition is met:

(1) Set  $k \leftarrow 1$ ;

(2) Repeat the following steps until  $k = k_{\max}$ :

(a) Shaking. Generate a point  $x'$  at random from the  $k$ th neighborhood of  $x$  ( $x' \in \mathcal{N}_k(x)$ );

(b) Move or not. If this point is better than the incumbent, move there ( $x \leftarrow x'$ ), and continue the search with  $\mathcal{N}_1$  ( $k \leftarrow 1$ ); otherwise, set  $k \leftarrow k + 1$ ;

Step of VND



# VND

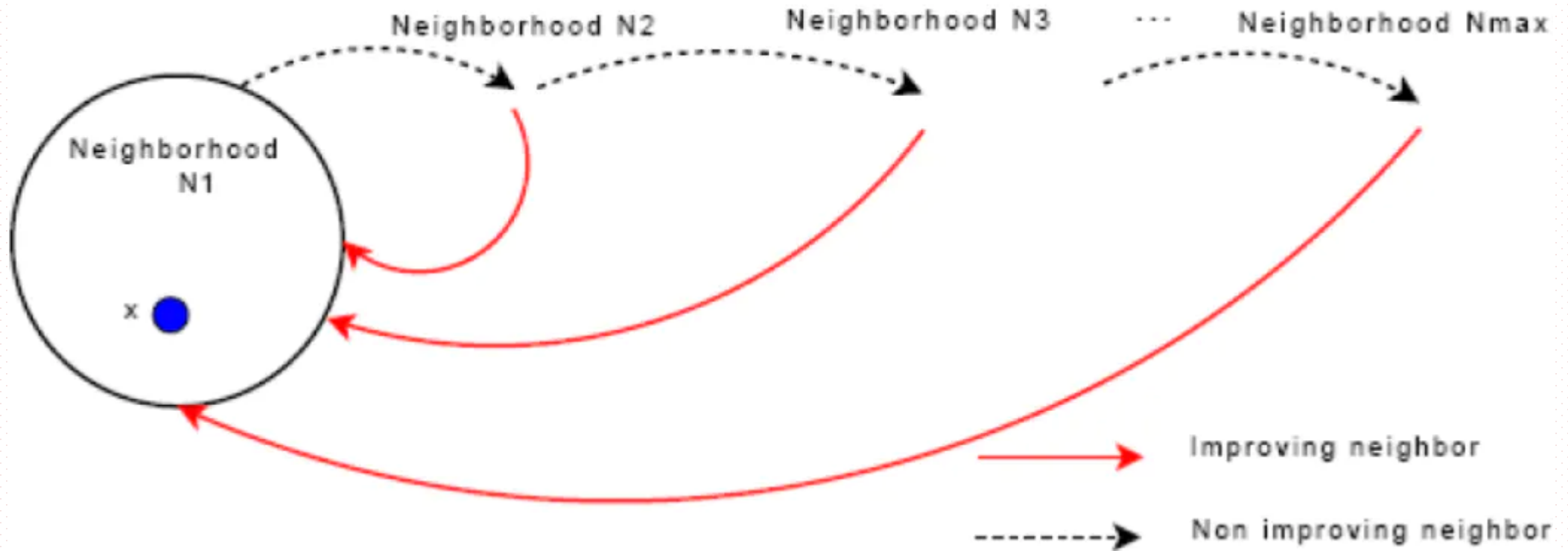


Figure of VND



# Shaking procedure

Shaking procedure: **disturbance operator**

It is used to produce different neighborhood solutions



# Variable Neighborhood Search (VNS)

Initialization. Select the set of neighborhood structures  $\mathcal{N}_k$ , for  $k = 1, \dots, k_{\max}$ , that will be used in the search; find an initial solution  $x$ ; choose a stopping condition;

Repeat the following sequence until the stopping condition is met:

(1) Set  $k \leftarrow 1$ ;

(2) Repeat the following steps until  $k = k_{\max}$ :

(a) Shaking. Generate a point  $x'$  at random from the  $k$ th neighborhood of  $x$  ( $x' \in \mathcal{N}_k(x)$ );

(b) Local search. Apply some local search method with  $x'$  as initial solution; denote with  $x''$  the so obtained local optimum;

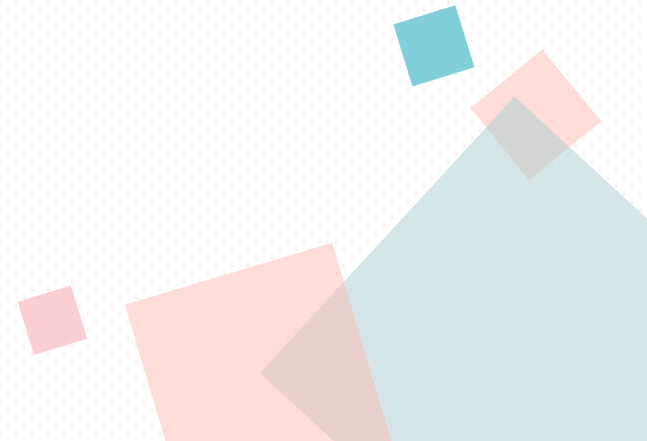
(c) Move or not. If this local optimum is better than the incumbent, move there ( $x \leftarrow x''$ ), and continue the search with  $\mathcal{N}_1$  ( $k \leftarrow 1$ ); otherwise, set  $k \leftarrow k + 1$ ;

Step of VNS



# Stopping Condition

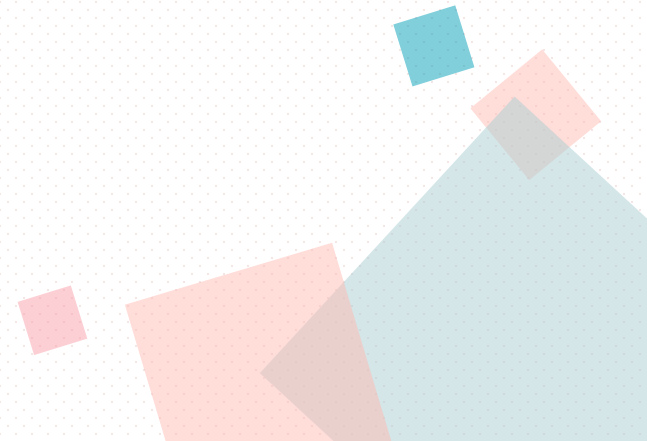
- Maximum CPU time
- Maximum number of iterations
- Maximum number of iterations between two improvements





# Extension of VNS

- Reduced VNS: A simplification of VNS, it gets rid of local search, in order to reduce running time.
- Skewed VNS: Once the best solution in a large region has been found it is necessary to go quite far to obtain an improved one.





PART

# Advantages and disadvantages



# Advantages and disadvantages

Advantages

Advantages:

- Simple. The principle are simple and can be applied widely
- Accurate. The accuracy of the solution is guaranteed
- Time-saving. Short computing time.

Disadvantages:

- It takes a lot of experience to design neighborhood and initial solution.
- 