



COMBINATORIAL OPTIMIZATION

$\langle s, f \rangle$: an instance

s : Solutions Set

$f : s \rightarrow \mathcal{R}$ Cost function to minimize (Max)

Find $s^* \in S$ s.t.

$f(s^*) \leq f(s), \forall s \in S$ (MIN)

or

$f(s^*) \geq f(s), \forall s \in S$ (MAX)



Local Search (LS)

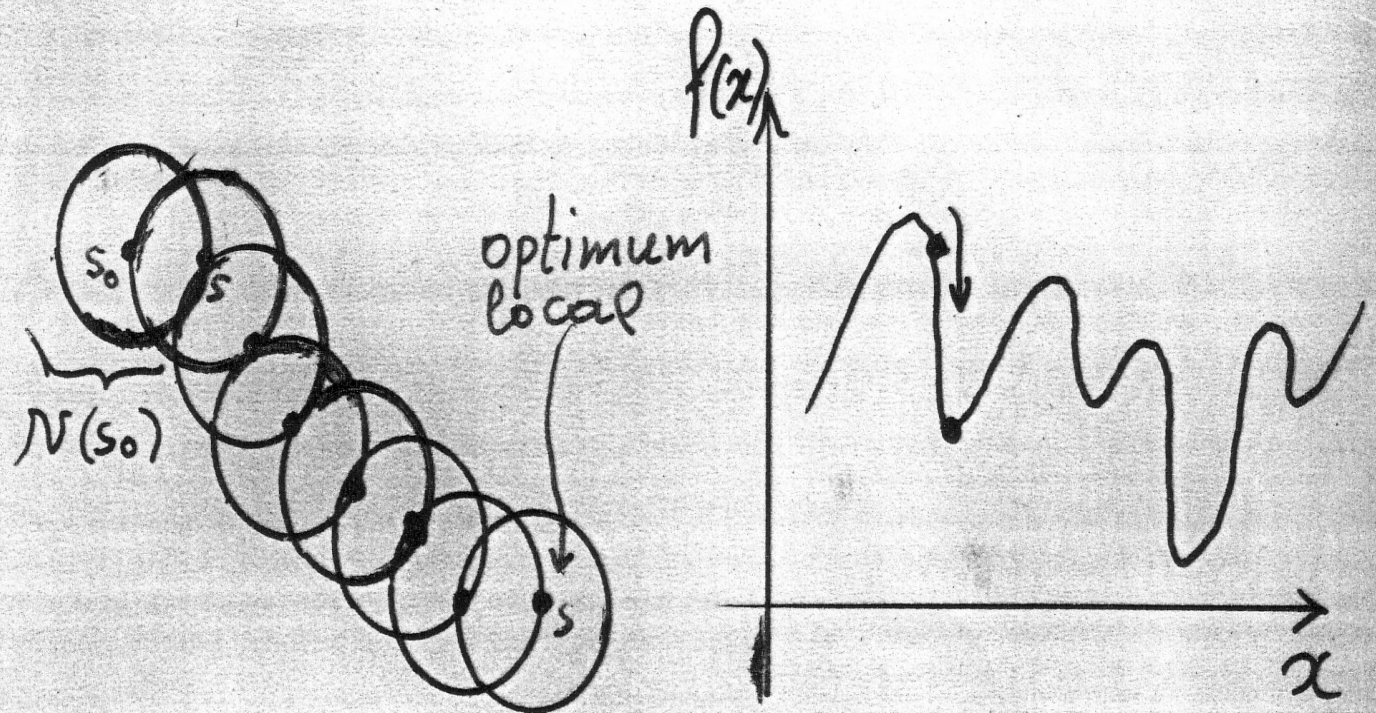
- Neighborhood structure :
 - i solution
 - $N : S \rightarrow 2^S$
 $i \mapsto N(i) \subseteq S$
 $N(i) =$ "near" to i solutions
- \tilde{i} is a local minimum if
 $f(i) \leq f(j), \forall j \in N(i)$
- \tilde{i} is a local maximum if
 $f(i) \geq f(j), \forall j \in N(i)$



Local Search Algorithm

- Define a neighborhood $N(S)$
- Initial solution $S = S_0$
- REPEAT
 - Find a solution $S' \in N(S)$
improving the cost $S := S'$
 - If S' does not exist STOP (local optimum)

The local search algorithm

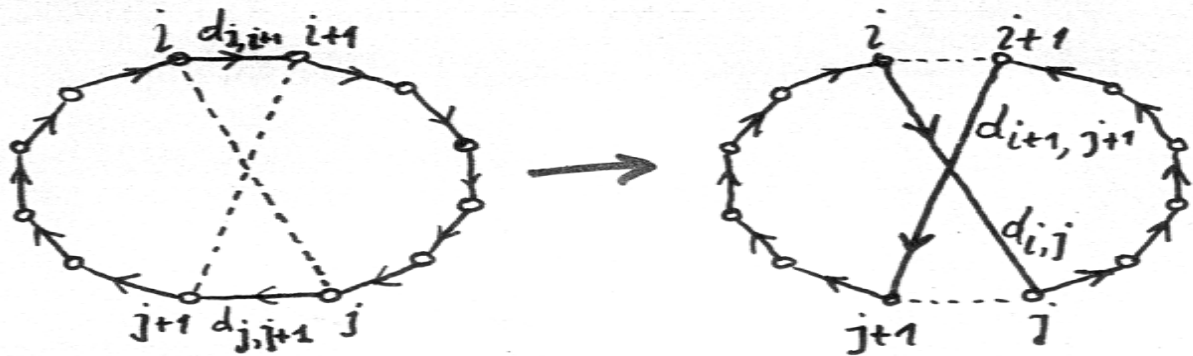




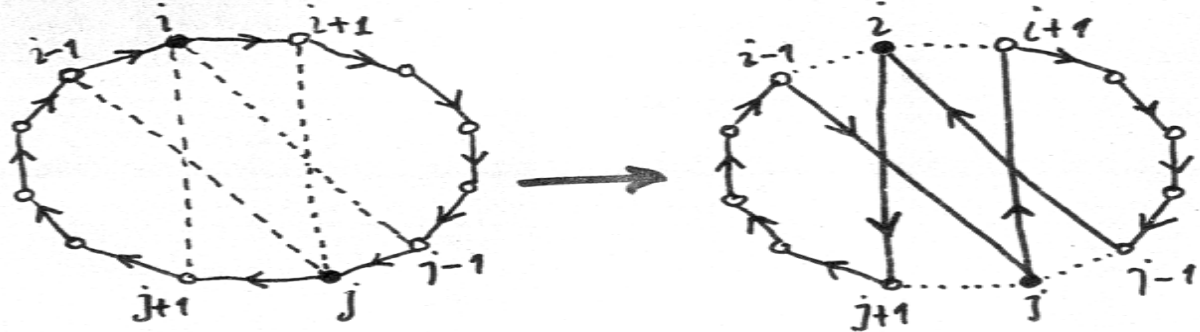
Examples

- The Traveling Salesman Problem
 - 2 - opt , 3 - opt , . . . , k - opt
 - 2 - exchange

2-opt



q-exchange





Examples

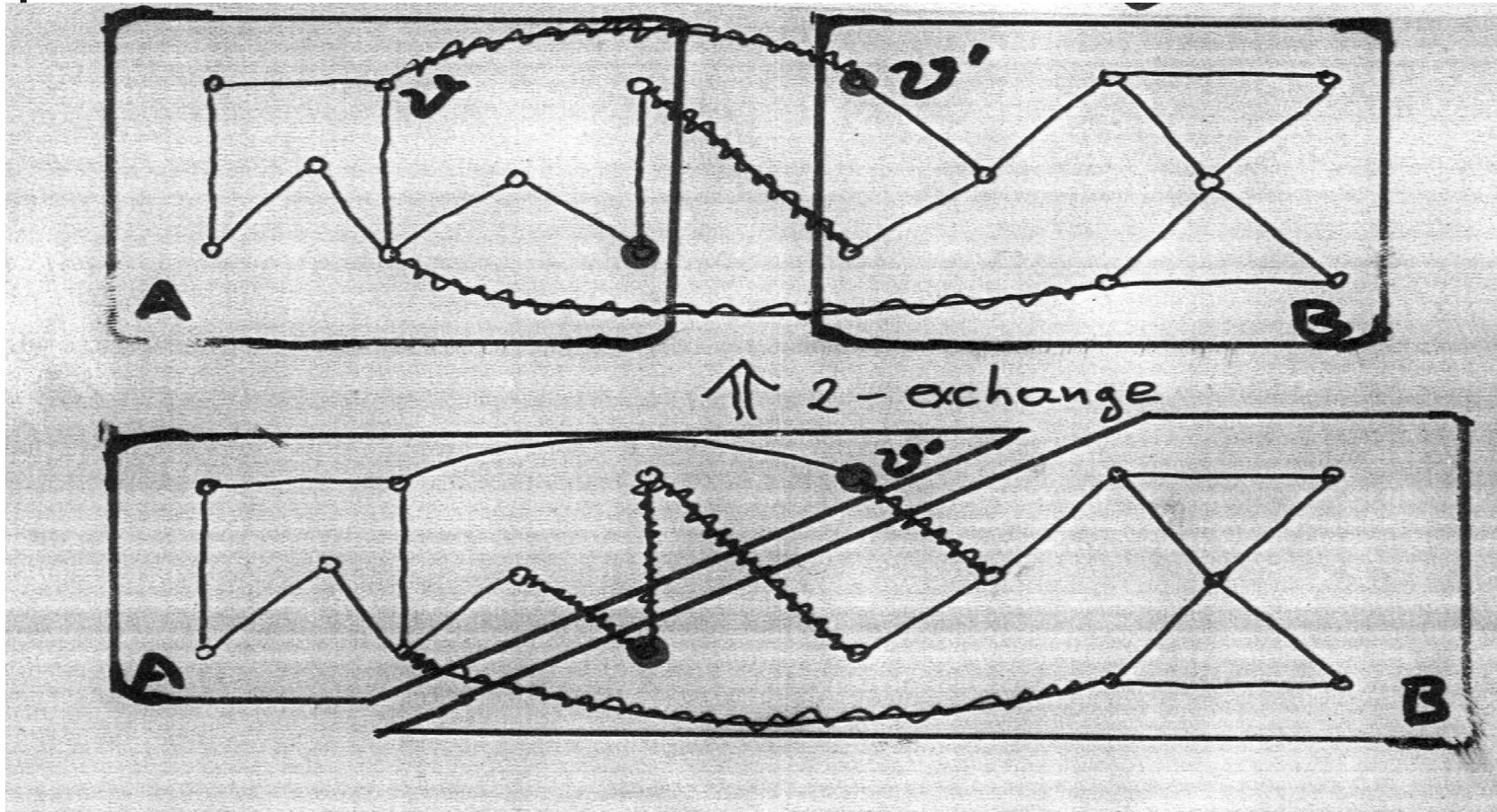
- The Bipartitioning of a weighted graph $G (V , E , W)$, $|V| = 2n$.

Find partitions A , B of V with

$|A| = |B|$ and

Minimizing $f (A , B) = \sum_{\substack{g \in A \\ g' \in B}} \omega_{g g'}$

Graph Bipartitioning





Search strategies in LS

- First improvement
- Best improvement
- Worst improvement