

# LE08: Combinatorial optimization

## Backtracking and branch-and-bound

*Rucksack-Backtrack2*, a recursive call with  $x_{k+1} = 1$ , is only executed if the cumulative size of the already selected items plus the size of the  $(k + 1)$ -th item **does not exceed the total capacity**  $K_0$ . A bounding function  $B(x)$  is used to reduce the search space. For maximization problems,  $B(x)$  must represent an **upper bound** for the maximum value  $P(x)$  of all feasible solutions in the subtree with root  $x$ . A subtree can be pruned if the computed bounding function  $B(x)$ . The value of the current optimal solution,  $optf$ , is **less than or equal** to the currently optimal value, since the optimal solution in this subtree cannot be improved. The main improvement of *Rucksack-Backtrack3* over *Rucksack-Backtrack2* is the use of a **bounding function to truncate** subtrees early. The bounding function  $B(x)$  for the integer backpack problem is derived by adding the value of the partial solution  $f(x)$  to the value of an optimal **rational backpack** for the remaining items. To directly determine an optimal rational backpack, the items must be **listed in descending order** according to the **ratio**  $f_i/g_i$  (value per weight) should be sorted.

## Travelling Roundabout Problem (TSP)

The traveling salesman problem is computationally demanding because it is classified as **NP-hard**. A traveling salesman is mathematically defined as **as a simple circuit** in  $K_n$  containing all vertices (a Hamiltonian circuit). Since the traveling salesman problem is a minimization **problem**, a bounding function  $B(x)$  must provide a **lower bound** for the cost of all possible extensions of the partial solution  $x$ . The bounding function  $B(x)$  for the TSP is composed of the sum of the edges already traversed and the value of the **minimum spanning tree** of the remaining subgraph.

## Heuristic algorithms

Heuristic algorithms replace backtracking when combinatorial optimization problems have a **very large search space**. The **quality** of an approximate solution provided by a heuristic algorithm is generally unpredictable. A **neighborhood**,  $N$ , is defined as a **mapping**,  $N : X \rightarrow P(X)$ , that maps each solution  $x \in X$  to a set of **neighboring**. For the knapsack problem, two knapsacks are considered neighboring if they differ by exactly one item, a concept known as the **Hamming distance** ( $d(x, y) = 1$ ). In the traveling salesman problem, the neighborhood is typically defined by the **Lin-2-Opt step**.

A feasible solution  $x^* \in X$  is considered a **local maximum** if  $f(x^*) \geq f(x)$  for all feasible  $x$  in the **neighborhood**  $N(x^*)$  holds. In the uphill method, for a feasible solution  $x$ , a neighboring feasible solution  $y \in N(x)$  with a **higher value** is constructed. The uphill method is called the method of **steepest ascent if a feasible solution with maximum value** is always chosen in each neighborhood. The generic algorithm *HeuristicSearch* terminates prematurely if the heuristic  $H_N$  **no** neighboring feasible successor  $y$  is found (i.e.,  $y = fail$ ). Combinatorial optimization problems typically have a **very large number of local optima**.