

Algorithms: Design and Analysis, Part II

# Local Search

Principles of Local Search

### Neighborhoods

Let X = set of candidate solutions to a problem.

Examples: Cuts of a graph, TSP tours, CSP variable assignments

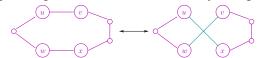
Key ingredient: Neighborhoods

- For each  $x \in X$ , specify which  $y \in X$  are its "neighbors"

Examples: x, y are neighboring cuts  $\iff$  Differ by moving one vertex

x, y are neighboring variable assignments  $\iff$  Differ in the value of a single variable

x, y are neighboring TSP tours  $\iff$  Differ by 2 edges



## A Generic Local Search Algorithm

- (1) Let x =some initial solution.
- (2) While the current solution x has a superior neighboring solution y:

Set x := y

(3) Return the final (locally optimal) solution x

#### **FAQ**

Question: How to pick initial solution x?

Answer #1: Use a random solution.

 $\Rightarrow$  Run many independent trials of local search, return the best locally optimal solution found.

Answer #2: Use your best heuristics

(i.e., use local search as a postprocessing step to make your solution even better).

Question #2: If there are superior neighboring y, which to choose?

Possible answers: (1) Choose at random, (2) biggest improvement, (3) more complex heuristics.

Question #3: How to define neighborhoods?

Note bigger neighborhoods  $\Rightarrow$  slower to verify local optimality, but fewer (bad) local optima

Answer: Find "sweet spot" between solution quality and efficient searchability.

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#### FAQ II

Question: Is local search guaranteed to terminate (eventually)?

Answer: If X is finite and every local step improves some objective function, then yes.

Question: Is local search guaranteed to converge quickly?

Answer: Usually not. [though it often does in practice] (see

"smoothed analysis")

Question: Are locally optimal solutions generally good approximations to globally optimal ones?

Answer: No. [To mitigate, run randomized local search many times, remember the best locally optimal solution found]