

Randomized search and web scalability



Optimization problems: from Maths to CS to user experience

- ◆ optimization
 - ◆ knapsack
 - ◆ travel planning
 - ◆ Hiring (seen in lec. 4)
- ◆ clusterization
 - ◆ web search engines (clustering & ordering)
- ◆ classification
 - ◆ voice/face recognition
 - ◆ word best match: soundness, ortographic correction

Operational research

It is desirable to model choice as a minimization problem.

- ◆ Given a set of possible solutions (search space) find the best solution that maximize/minimize a "energy"/"cost" function.
 - ◆ given a set of bags, find the best arrangement in the trunk of your car
 - ◆ given a set of apples of various size and a price table that define the price respect of the minimal size, find the best size that maximize earnings.

Optimal Solution vs Approximation

For almost all "interesting" problems, it is "hard" to find the best solution.



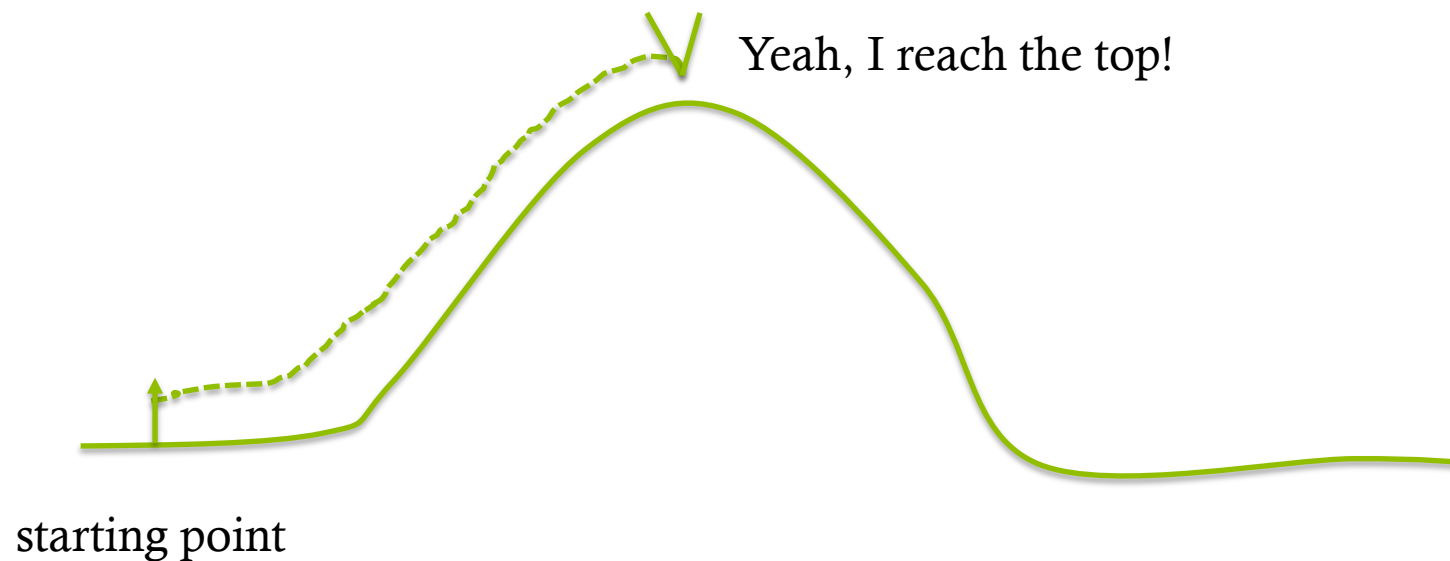
We have to find something similar (near) to the best.



We need a search path for a good approximation

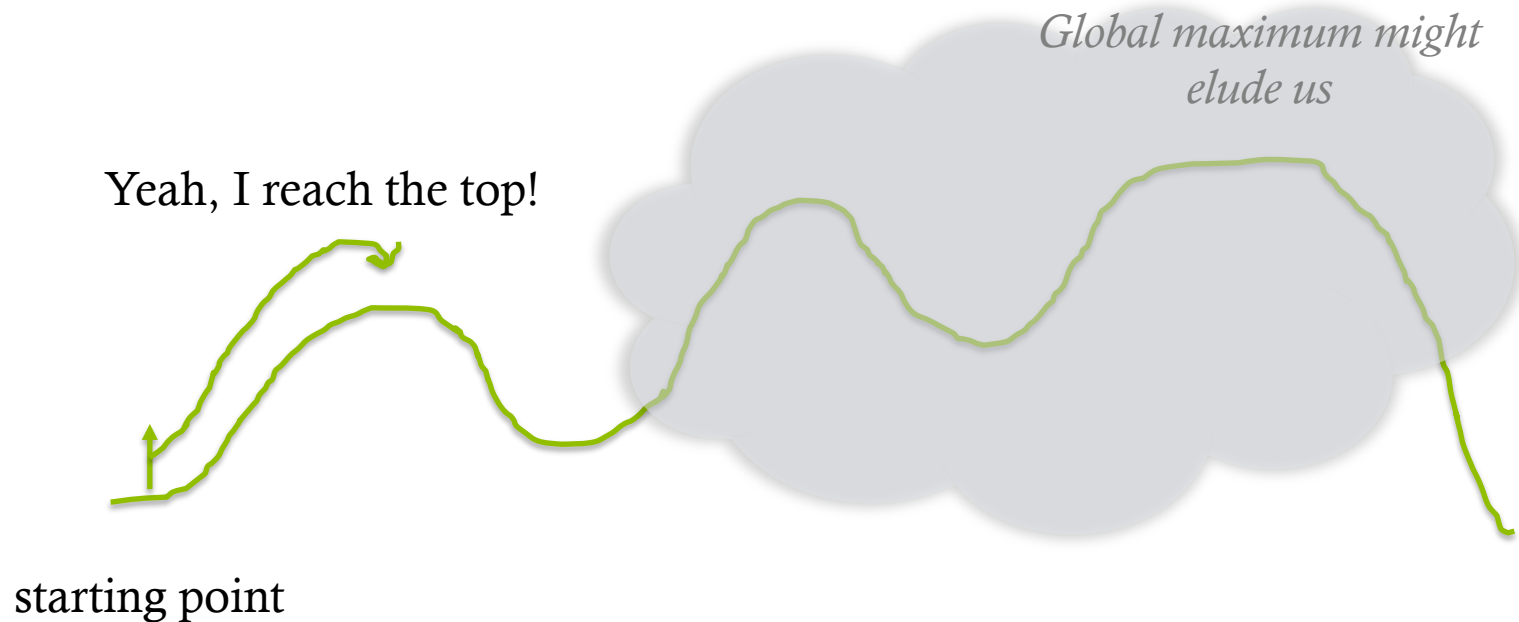
Greedy Methods

- ◆ Utility function is way different from a straight line. Search by always improving on the local condition



The local-max problem

- ◆ If only I could see farther...

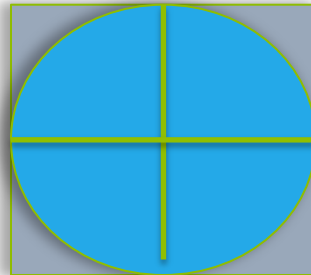


Using chance/randomness to compute

Montecarlo methods: use frequencies to approximate probabilities to then compute exact values.

- ◆ [Buffon, 1733 circa] calculates π by a physical experiment:
- ◆ uniform randomly take a set of point inside a square containing a circle, if it is inside (easy to calculates) I count it on the area of the circle and the square, otherwise I count it only for the square.

$$A_{\text{circle}} = \pi r^2$$



$$A_{\text{square}} = (2r)^2 = 4r^2$$

Ant colonies (best path)

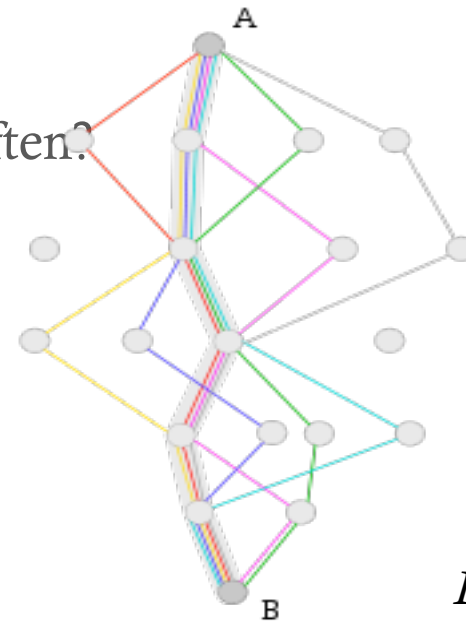
- more randomly around, sign the local best paths and (likely) continue search on it.

- Shall the best path be visited more often?

- Individuals are “weak” but

- highly collaborative

- Deliberately apply randomness



From Wikipedia

Genetic algorithms

Probably the best (random) algorithm inspired by nature

- ◆ Encode an individual's features as a binary string: the DNA
- ◆ Formalize fitness to solve a task a function: DNA->number
- ◆ Take a set of good candidates, the parent generation
- ◆ Create offsprings by randomly combining parents' DNA + random mutations: the children generation
- ◆ Repeat generations in the hope some *uber-individual* will arise

Genetic: How it Works!

Given a generation G_n , the next G_{n+1} is obtained by union of:

- ◆ THE WINNERS: some actual "best fitting" individual (not all, not the bestest)
- ◆ THE SONS: some new individual obtained by join pieces of other individuals (crossover)
- ◆ THE MUTANTS: some actual individual in which we have made some radomn changes (mutations)
- ◆ ...and the first generation G_0 ? randomly chosen? crafted selections? Does not matter!

Consequences

- ◆ On the Web, it's hard to assess what is the best solution and what value it should have
- ◆ Traditional applied Mathematics does not directly apply.
- ◆ On-line aspect: the Secretary problem
- ◆ Incomplete information: the greedy search
- ◆ The [web] scalability/big data aspect: apply nature-inspired methods and hope to get the best or near best solutions.