



Combinatorial Optimization

Problem Types
Hill-Climbing

Adversarial Search

Combinatorial Optimization

Types of Search Problems

- Shortest Path (SampleWorld, tile puzzle, driving directions)
 - given operators and costs
 - want least-cost path to goal
 - goal depth/cost is unknown
- Constraint Satisfaction (map coloring, n-queens)
 - any goal is fine
 - fixed depth
 - explicit constraints
- Combinatorial Optimization (TSP, set cover)
 - want least-cost goal
 - maximum depth = number of variables
 - every leaf is a solution

Hill Climbing

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- 1: $Sol \leftarrow$ a random solution
 - 2: **for** $limit$ runs **do**
 - 3: $New \leftarrow$ random neighbor of Sol
 - 4: **if** New is better than Sol **then**
 - 5: $Sol \leftarrow new$
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Related Techniques

Combinatorial Optimization

Problem Types

Hill-Climbing

Adversarial Search

- best neighbor – gradient-descent
- random restarts
- simulated annealing
- population optimization – genetic algorithms

Adversarial Search

Search Twist

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Search

Search Twist

Minimax

Tic-tac-toe

Decisions with an adversary:

- chess, tic-tac-toe, go
- adversary prevents some solution paths
- we want best assured outcome

Minimax

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Tic-tac-toe

Each *ply* in search tree corresponds to half a *move*

Terminal states are labeled with value

Instead of full solution tree, use a *static evaluation function* on non-terminal states

Evaluation for Tic-tac-toe

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Tic-tac-toe

A *3-length* is a complete row, column, or diagonal

$$\begin{aligned} \text{value of position} &= \infty \text{ if win for me,} \\ \text{or} &= -\infty \text{ if win for you,} \\ \text{otherwise} &= \# \text{ 3-lengths for me} - \\ &\quad \# \text{ 3-lengths for you} \end{aligned}$$

Two-Ply Search from Game Start

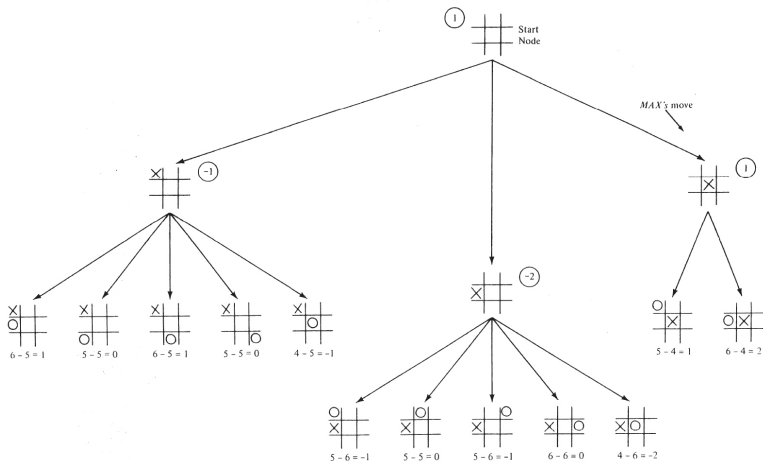
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Two-Ply Search: Second Move

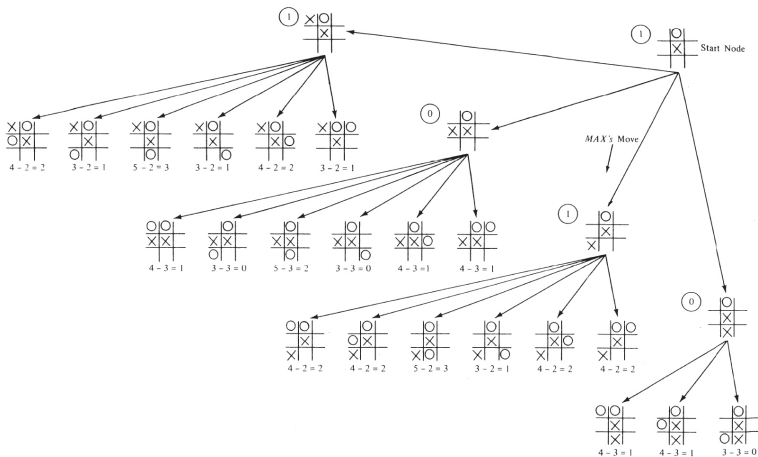
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Two-Ply Search: Third Move

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