Artificial Intelligence

Logic 3: Local Search

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based on slides by Thomas Keller and Malte Helmert (University of Basel)

Local Search: GSAT

Local Search for SAT

- Apart from systematic search, there are also successful local search methods for SAT.
- These are usually not complete and in particular cannot prove unsatisfiability for a formula.
- They are often still interesting because they can find models for hard problems.
- However, all in all, DPLL-based methods have been more successful in recent years.

Local Search for SAT: Ideas

local search methods directly applicable to SAT:

- candidates: (complete) assignments
- solutions: satisfying assignments
- search neighborhood: change assignment of one variable
- heuristic: depends on algorithm; e.g., #unsatisfied clauses

GSAT (Greedy SAT): Pseudo-Code

auxiliary functions:

- violated(Δ , *I*): number of clauses in Δ not satisfied by *I*
- flip(I, v): assignment that results from I when changing the valuation of proposition v

function $GSAT(\Delta)$:

```
repeat max-tries times:

I := a \text{ random assignment}
repeat max-flips times:

if I \models \Delta:

return I

V_{greedy} := \text{the set of variables } v \text{ occurring in } \Delta

for which violated(\Delta, flip(I, v)) is minimal

randomly select v \in V_{greedy}

I := \text{flip}(I, v)

return no solution found
```

Whiteboard: $(A \lor \neg B) \land (A \lor C) \land (\neg A)$ with $I_0 = \{A \mapsto T, B \mapsto T, C \mapsto F\}$

GSAT: Discussion

GSAT has the usual ingredients of local search methods:

- hill climbing
- randomness (although relatively little!)
- restarts

empirically, much time is spent on plateaus:



Local Search: Walksat

Walksat: Pseudo-Code

 $lost(\Delta, I, v)$: #clauses in Δ satisfied by I, but not by flip(I, v)

function Walksat(Δ):

```
repeat max-tries times:
     I := a random assignment
     repeat max-flips times:
           if l \models \Delta:
                return /
           C := randomly chosen unsatisfied clause in \Delta
           if there is a variable v in C with lost(\Delta, I, v) = 0:
                V_{choices} := all such variables in C
           else with probability p<sub>noise</sub>:
                V_{\text{choices}} := \text{all variables occurring in } C
           else:
                V_{\text{choices}} := variables v in C that minimize lost(\Delta, I, v)
           randomly select v \in V_{choices}
           I := flip(I, v)
```

return no solution found

Walksat vs. GSAT

Comparison GSAT vs. Walksat:

- much more randomness in Walksat because of random choice of considered clause
- "counter-intuitive" steps that temporarily increase the number of unsatisfied clauses are possible in Walksat
- \rightsquigarrow smaller risk of getting stuck in local minima