Making the first solution good!

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Constraint-Programming



Many business applications Configuration | Planning | Scheduling | Packing



Used in production for years by many companies → Mature technology



Constraint-Programming



A programming paradigm between AI and OR to model and solve constrained problems in a declarative way.

Constraint Programming represents one of the closest approaches computer science has yet made to the Holy Grail of programming: the user states the problem, the computer solves it. [Eugene Freuder]









Guess what?







They lied!



Counter-Example



Traveling Salesman Problem

- Everyone knows it
- Trivial to get a solution
- Very easy to get a good solution

Yet in CP

- Tricky to model the cost
- Cannot scale without "circuit" constraint
- Require specifying search
 - ✤ First solution will be random -> VERY BAD
 - ♦ Enumeration will never reach a descent solution





Constraint-Programming

CP is complex!

- Modeling
- Global constraints
- Search procedures
- > The code is not so declarative

CP is a technology for experts

- Experts on challenging problems : OK
- Poor results on simple problems : KO
- > Too often the case in black-box optimization



Objective



Constraint-Programming should be

At least as simple At least as good

As coding a simple heuristic





Improving Black-box solving

Filtering Very hard to get generic results

→ Search



Black-box search



Existing approaches are Fail-first

- MinDomain, DomWDeg, ABS, IBS, etc.
- Designed to escape from unfeasible space
 > Better not get in!
- Good for very constrained problems
 > Very rare ! (to avoid "no solution" you often relax it)
- Good for optimality certificates
 - > Once you are already close to optimum
 - Unrealistic on most applications anyway







Given a variable X to branch on

- For each value V in its domain
 - Apply X=V
 - Propagate
 - Record objective LB (UB) bound for minimization (max)
 - Backtrack
- Select the value with lowest LB (highest UB)

CP variant of MIP's strong branching Branching variant of SAC





Given a variable X to branch on

- For each value V in its domain
 - Apply X=V
 - Propagate
 - Record objective LB (UB) bound for minimization (max)
 - Backtrack
- Select the value with lowest LB (highest UB)
- $\rightarrow 1^{st}$ solution is good!
- →100% generic ©
- → May be combined with any variable selector







Results on 50-cities TSP instance

Search	1st sol time	1st sol cost	Best sol cost (30s)
DEFAULT	0.02	3775	2043







Results on 50-cities TSP instance

Search	1st sol time	1st sol cost	Best sol cost (30s)
DEFAULT	0.02	3775	2043
MIN_COST_SUCC	0.03	629	352

Only 1 min for an expert, but many users would not do it





Results on 50-cities TSP instance

Search	1st sol time	1st sol cost	Best sol cost (30s)
DEFAULT	0.02	3775	2043
MIN_COST_SUCC	0.03	629	352
BEST_IMPACT	0.60	455	327







Conclusion



Black-box value selector for optimization

- Simple
- Generic
- Efficient

Used in Choco Solver default configuration
 → Helped to win a lot of medals this year! ☺



Next steps



Next steps: identify (groups of) decision variables

- Different from variable selector
- Does not exist in any solver
- Need to analyze variables & constraints
- ➤ Great Challenge!



Thank you





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