

# Day 14 Notes

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May 29, 2019

## 1 Agenda

- Branch and Bound to solve ILP
- Announcements
  - Reading
  - Project due Monday
  - Quiz Tuesday

## 2 Branch & Bound

- Review of last class example
- LP soln is **optimistic bound** on ILP soln
- Add constraints to break up problem into subproblems
- Solve each subproblem with LP solver
- Repeat recursively until subproblem has integral soln in LP
- Don't expand subproblem if...
  - Subproblem is infeasible (No LP solns)
  - LP soln is integral
- How to explore graph?
- Best soln is to use DFS
- Z score of LP soln at parent node is upper bound on Z score of children
- This means that branches with low Z scores can be pruned!
- Suddenly problem not exponential time any more!

### Fathoming Rules: don't expand a subproblem if...

1. Subproblem is infeasible
2. LP solution is integral

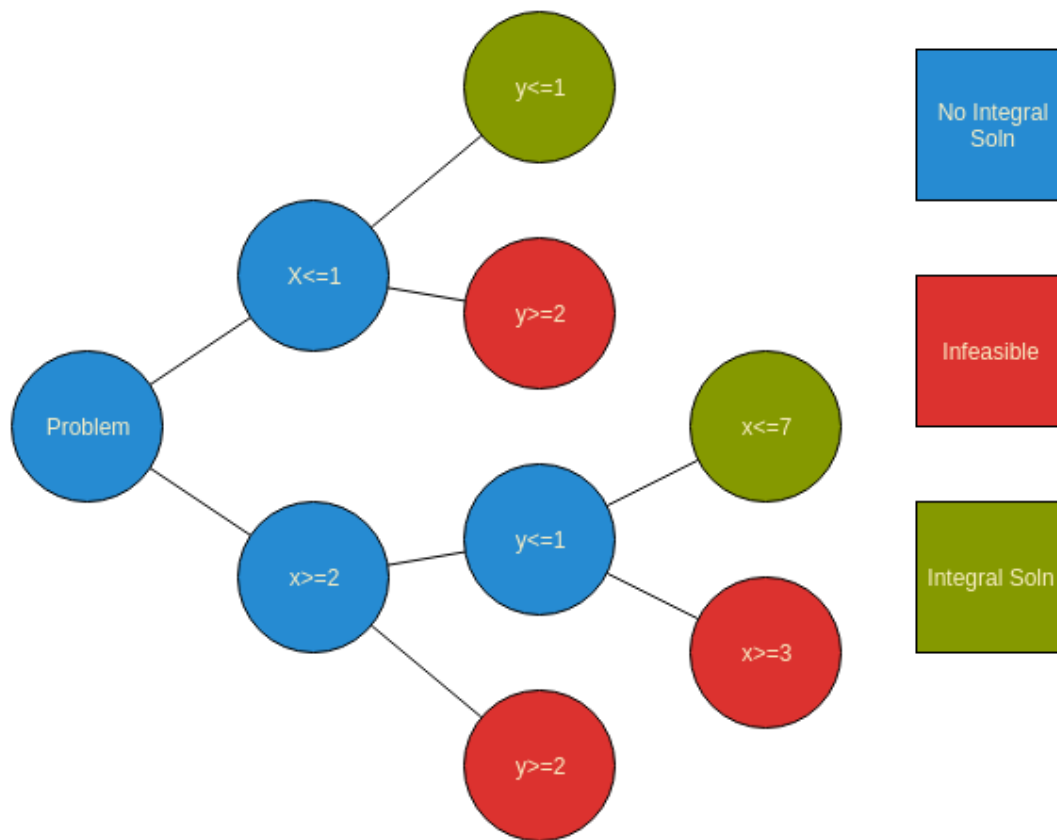


Figure 1: Subproblem Search Diagram

3. Optimistic bound is worse than the best integral solution found so far
  - This only prunes if the bound is tight.
  - Branches with loose bound will not be pruned until far down the tree
  - LP bound is quite tight
  - What order to branch variables?  $x$  first?  $y$  first?
  - Crucial decision, but no fixed best algorithm - solvers offer choice
  - **IDEA:** Try different sized problems with different strategies, find optimal domain for each strategy. Potentially weed out strategies that don't have a region where they are optimal.

## Problem Example

$$Z = 9x_1 + 5x_2 + 6x_3 + 4x_4$$

$$6x_1 + 3x_3 + 5x_3 + 2x_4 \leq 10$$

$$x_3 + x_4 \leq 1$$

$$-x_1 + x_3 \leq 0$$

$$-x_3 + x_4 \leq 0$$

$$x_i \in \{0, 1\}$$

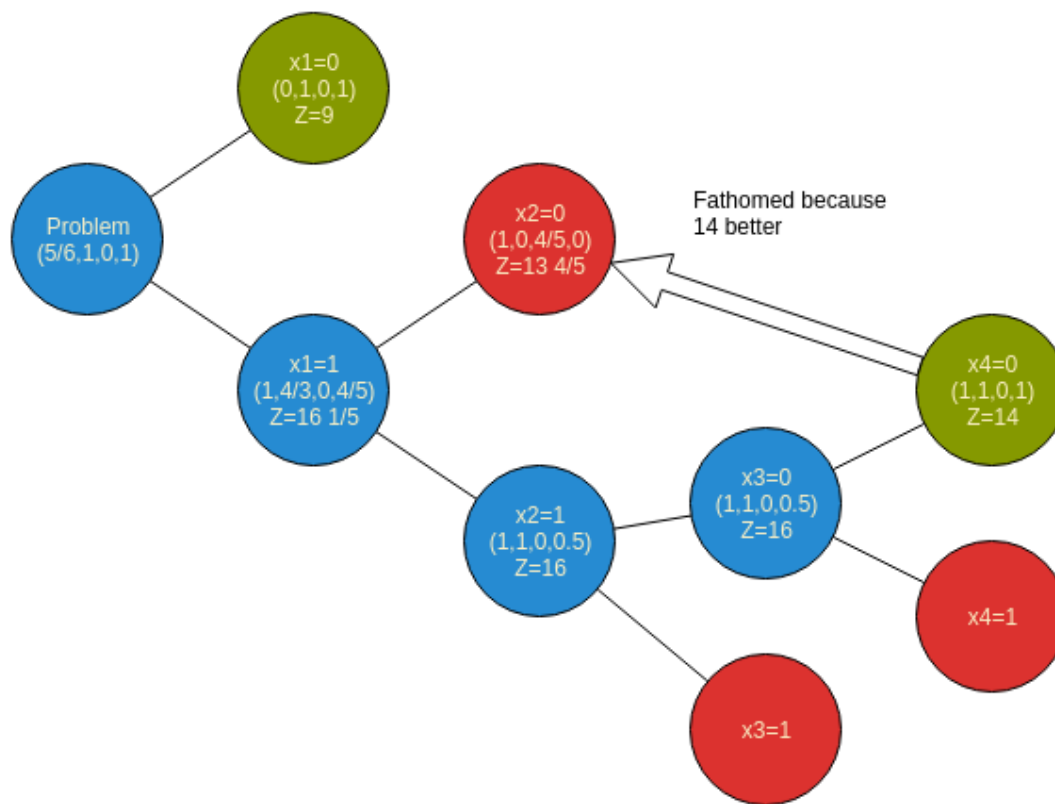


Figure 2: Example Problem Search

## 3 Project Help

### Graph Coloring ILP

- Goal: Minimize Conflicts
- Constraints: # colors, edges
- Graph given as list of edges -> constant set param in ampl

- Convert into adjacency matrix -> Boolean matrix (numNodes x numNodes)
- Possible variables:
  - `Colors[numNodes] = {0..numColors}` -> hard to create linear objective
  - `Colors[numNodes,numColors] = {0,1}` -> Conflicts easy! Just sum of columns!

Table 1: caption

	c1	c2	c3	c4
node 1	0	1	0	0
node 2	0	1	0	0
node 3	0	0	1	0
conflicts	0	1	0	0

```
param edge {i in 0..numNodes-1, j in 0..numNodes-1} :=
  (if(i,j) in edgelist or (j,i) in edgelist then 1 else 0);
```

## 4 Advanced ILP Techniques

### Fix Variables

- Consider constraint  $3x_1 \leq 2$ .  $x_1$  must be 0.
- $3x_1 + x_2 \leq 2$ :  $x_1$  must be 0.
- $5x_1 + x_2 - 2x_3 \leq 2$ :  $x_1$  must be 0.
- In general, constants bigger than constraint must be set to 0.

### Eliminate Redundant Constraints

- If constraint depends entirely upon value of different constraint, eliminate it.

$$3x_3 - x_5 + x_7 \leq 1$$

$$x_2 + x_4 + x_0 \leq 1$$

$$x_1 - 2x_5 + 2x_6 \geq 2$$

$$x_1 + x_2 - x_4 \leq 0$$

- Fix variables
  - $x_3 = 0$
  - $x_6 = 1$

- $x_5 = 0$
- $x_2 = 0$
- $x_1 = 0$
- $x_7$  is only real free variable!

## Cutting Planes

- Consider problem in fig. 3
- Top right corner points are not integral solutions
- Can eliminate these infeasible points before sending to solver
- Do this elimination by adding a redundant constraint that all integral feasible solutions satisfy
- Consider  $6x_1 + 3x_2 + 5x_3 + 2x_4 \leq 10$
- If  $x_1, x_2, x_4 = 1$ , then this doesn't work
- Add  $x_1 + x_2 + x_4 \leq 2$  to speed up ILP solver.
- Without redundant constraint, solver produces  $(\frac{5}{6}, 1, 0, 1)$ , but the redundant constraint does not allow for this, allowing faster fathoming.

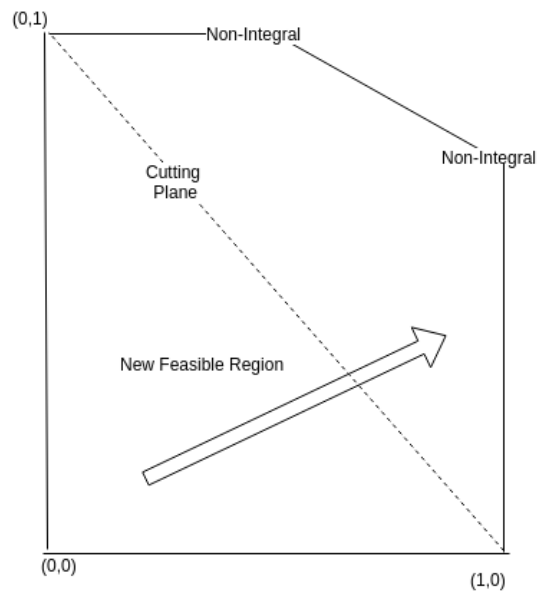


Figure 3: Cutting Plane Example