

# Integer Programming - Solution *Methods* - Branch and Bound

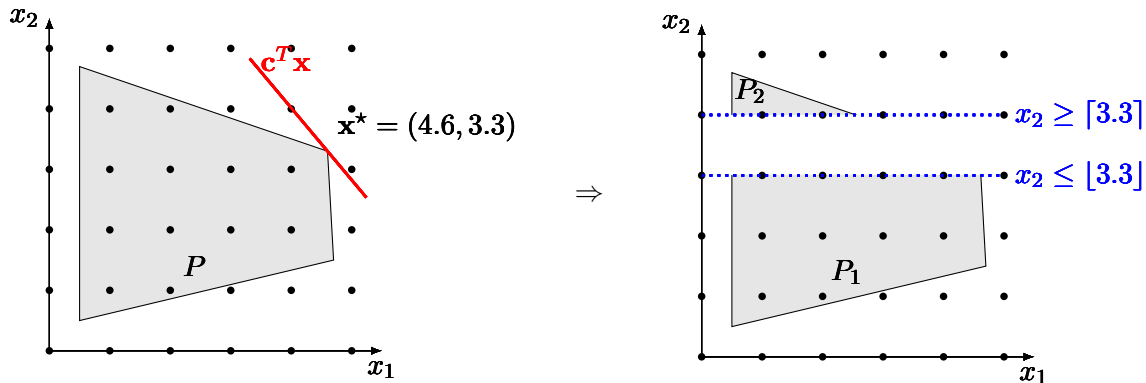
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Problem:

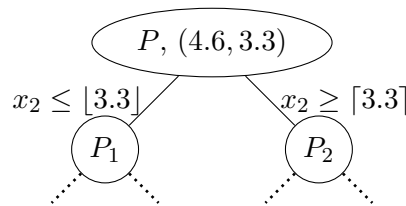
$$(IP) \begin{cases} \text{maximize} & \mathbf{c}^T \mathbf{x} \\ \text{subject to} & A\mathbf{x} \leq \mathbf{b}, \end{cases}$$

where  $\mathbf{c} \in \mathbb{Z}^n$ ,  $\mathbf{b} \in \mathbb{Z}^m$ ,  $A \in \mathbb{Z}^{m \times n}$ , and  $\mathbf{x} \in \mathbb{Z}^n$ .

Suppose we try to relax the problem and solve it as a linear programming problem. The set of feasible solutions is  $P$ . Suppose that the optimum is  $\mathbf{x}^* = (4.6, 3.3)$ . We know  $x_2$  cannot be 3.3. So we create two new instances, where we add constraints  $x_2 \geq \lceil 3.3 \rceil$  and  $x_2 \leq \lfloor 3.3 \rfloor$ . Variable  $x_2$  is a *branch variable*. We solve both instances and better of the solutions is the solution to the original problem.



The same process repeats with  $P_1$  and  $P_2$ . Result is a *big* branch and bound tree  $T$ .



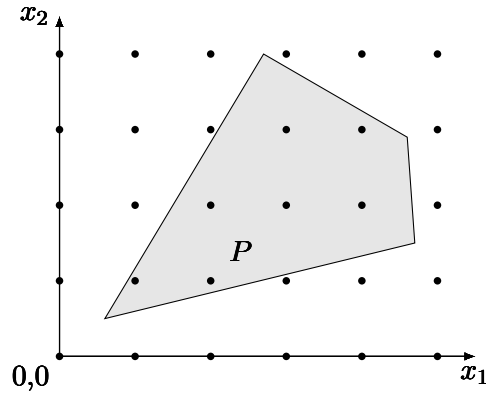
## Branch and (no Bound) outline

1. Let  $P = \{\mathbf{x} : A\mathbf{x} \leq \mathbf{b}\}$
2. Build tree  $T$  with one node  $P$  (and mark it unexplored)
3. while  $T$  has unexplored node  $X$
4.      $\mathbf{x}^* :=$  optimum for LP relaxation of  $X$ ; mark  $X$  explored
5.     If  $\mathbf{x}_i^* \notin \mathbb{Z}$  for some  $i$
6.          $X_1 := X \cap \{\mathbf{x} : \mathbf{x}_i \leq \lfloor \mathbf{x}_i^* \rfloor\}$
7.          $X_2 := X \cap \{\mathbf{x} : \mathbf{x}_i \leq \lceil \mathbf{x}_i^* \rceil\}$
8.         Add  $X_1$  and  $X_2$  to  $T$  as unexplored nodes
9. Return maximum of integer solutions in  $T$ .

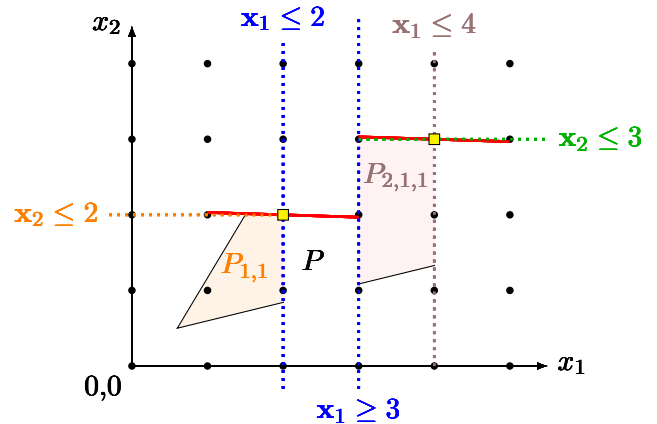
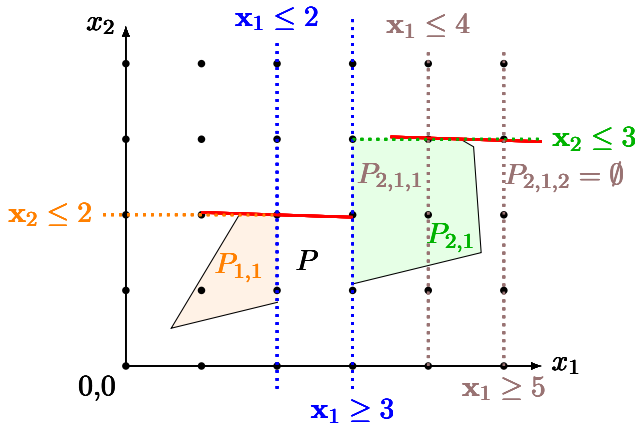
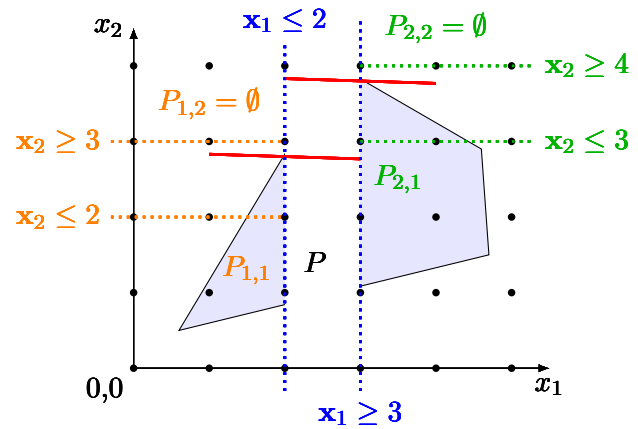
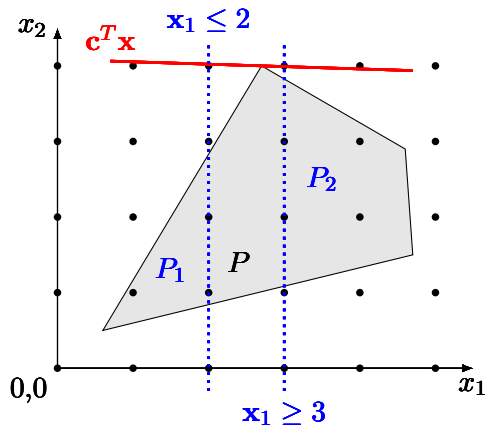
1: Consider problem

$$(IP) \begin{cases} \text{maximize} & 100x_2 + x_1 \\ \text{subject to} & (x_1, x_2) \in P, \end{cases}$$

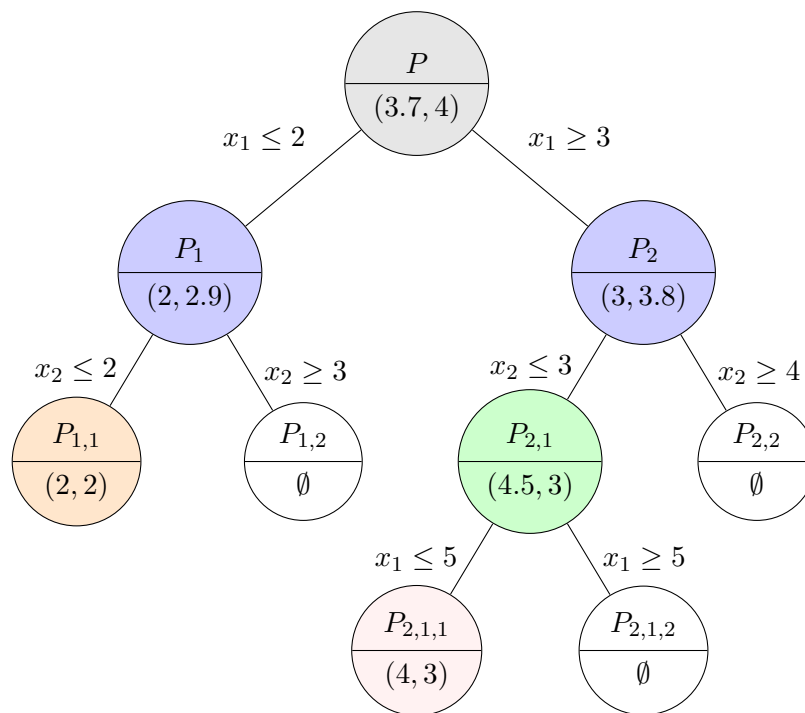
where  $P$  is depicted below. Solve  $(IP)$  using Branch and Bound. Create branch and bound tree  $T$ .



**Solution:** Here is the sequence of cuttings.



And this is the resulting tree  $T$ .



Notice that the leaves have either integer solution or are empty. Also notice that there is more than just one branching on  $x_1$ . And the optimum solution is  $(4, 3)$ , value 304.

**2:** Will branch and bound ALWAYS find an optimal solution if one exists?

**Solution:** Yes, this EVENTUALLY gets the right answer.

**3:** Is there a *good* bound on the size of the tree?

**Solution:** No - the tree may explode. It may have exponential size.

**4:** Is it possible to identify nodes in  $T$  that will not contain the optimal solution?

**Solution:** Sometimes. See the example above. Consider we computed node  $P_{2,1,1}$  and get an integer solution of value 304. This tells us that the optimum integral solution has value at least 304. Now we look at node  $P_1$  - it gives solution with value 292. In the whole subtree under  $P_1$ , all integer solutions in the subtree rooted at  $P_1$  will have value at most 292. Hence no need to solve under  $P_1$ . **That is why the method is branch and bound** Note: good idea to try to round and get some integers solutions - helps cut the tree. This is the bound part of the name.

**5:** What are (dis)advantages of processing nodes deep in the search tree vs nodes close to the root?

**Solution:** Deep is more likely to give integer solution. But more likely to be eliminated later by some better solution. No clear winner.

**6:** Which if a solution in a node has more non-integer coordinates, which variable to branch on first?

**Solution:** Depends on problem - branch on important first. Example - decide if building factory at all before deciding how many production lines it should have.

*Next time: Cutting Planes for Integer Programming.*