

- ① Find an IP that has an exponential number of branches. Prove that there are an exponential number of branches. Provide a bound for the number of branches.

Jerusalem (1974) offered this IP:

$$\begin{aligned} \max & x_1 \\ \text{s.t.} & 2x_1 + \dots + 2x_n = n \\ & x_i \in \{0, 1\}, \quad n \text{ an odd positive integer.} \end{aligned}$$

This family of problems ~~is~~ infeasible — no set of binary values for the  $x_i$  will result in a LHS that's odd.

If we take the greedy approach in constructing a solution to the linear relaxation of the initial problem, the root node of the branch-and-bound tree will look like this:

$$\boxed{\begin{array}{c} z=1 \\ (1, 1, \dots, 1/2, 0, \dots, 0) \end{array}}$$

where  $x_1, \dots, x_{\frac{n-1}{2}} = 1$ ,  $x_{\frac{n+1}{2}} = 1/2$ , and remaining  $x_i$  are 0.

The first level of branches are fixing  $x_{\frac{n+1}{2}}$  at either 0 or 1  $\rightarrow$  2 branches, for 1 fixed variable total. From these two, fixing another variable at either 0 or 1  $\rightarrow$  4 branches. We're safe to continue in this manner and have each B+B node (LP relaxation) stay feasible up to, but not including, tree level  $\frac{n+1}{2}$  — at which level some nodes must be infeasible.

$\Rightarrow$  can't d

① (cont'd)

As soon as a node has  $\frac{n+1}{2}$  variables fixed at 0 or 1, it becomes infeasible, since (if all 0) the LHS will be  $< n$ , and if all 1 the LHS is at least  $2(\frac{n+1}{2}) = n+1 > n$ .

So, as a conservative bound on # of branches to evaluate, we have  $1 + 2 + 4 + \dots + 2^{\frac{n-1}{2}}$

$$= \sum_{i=1}^{\frac{n-1}{2}} 2^i, \text{ exponential relative to the \# of variables in the problem.}$$

Note: Still more branches need to be evaluated to declare authoritatively the infeasibility of this IP.

Note also: We can declare this IP infeasible by inspection. Surely solvers can sniff this condition out beforehand without need to branch and bound.

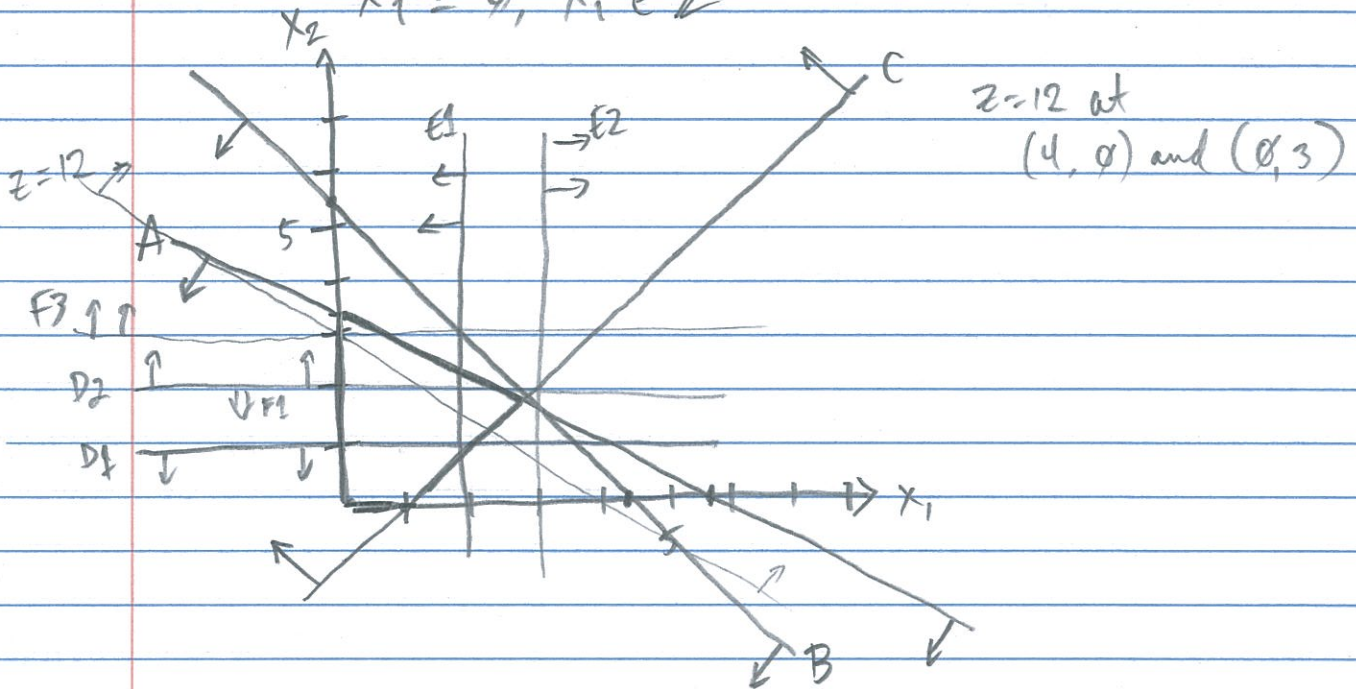
A B+B tree for this problem for  $n=5$  follows.





② Solve using breadth-first search,  $L \rightarrow R$ :

$$\begin{aligned} \max \quad & 3x_1 + 4x_2 \\ \text{s.t.} \quad & 3x_1 + 5x_2 \leq 17 \quad (A) \quad (5\frac{2}{3}, 0); (0, 3\frac{2}{5}) \\ & 5x_1 + 4x_2 \leq 22 \quad (B) \quad (4\frac{2}{5}, 0); (0, 5\frac{1}{2}) \\ & x_1 - x_2 \leq 1 \quad (C) \quad (1, 0); (0, -1) \\ & x_i \geq 0, x_i \in \mathbb{Z}^+ \end{aligned}$$



Root node:

①  $z = 15.25$   
 $(2.75, 1.75)$

Branching:

$D1: x_2 \leq 1$

$D2: x_2 \geq 2$

②  $z = 10$   
 $(2, 1)$   
fathom

③  $z = 15$   
 $(7/3, 2)$

$(2, 1), z = 10$   
best so far

Branching:  $E1: x_1 \leq 2$

$x_1 \geq 3$

④  $z = 14.8$   
 $(2, 2.2)$

⑤ Infeasible  
fathom

$x_2 \leq 2$

$x_2 \geq 3$

(cont'd)



2 (cont'd)

$(2,2),$   
 $z=14$   
 best so far

⑥  $\begin{array}{|c|} \hline z=14 \\ (2,2) \\ \hline \end{array}$   
 fathom

$x_2 \leq 2$

⑦  $\begin{array}{|c|} \hline z=14 \\ (2/3, 3) \\ \hline \end{array}$   
 fathom:  
 children can't do  
 better than  
 $z=14$  @ ⑥.

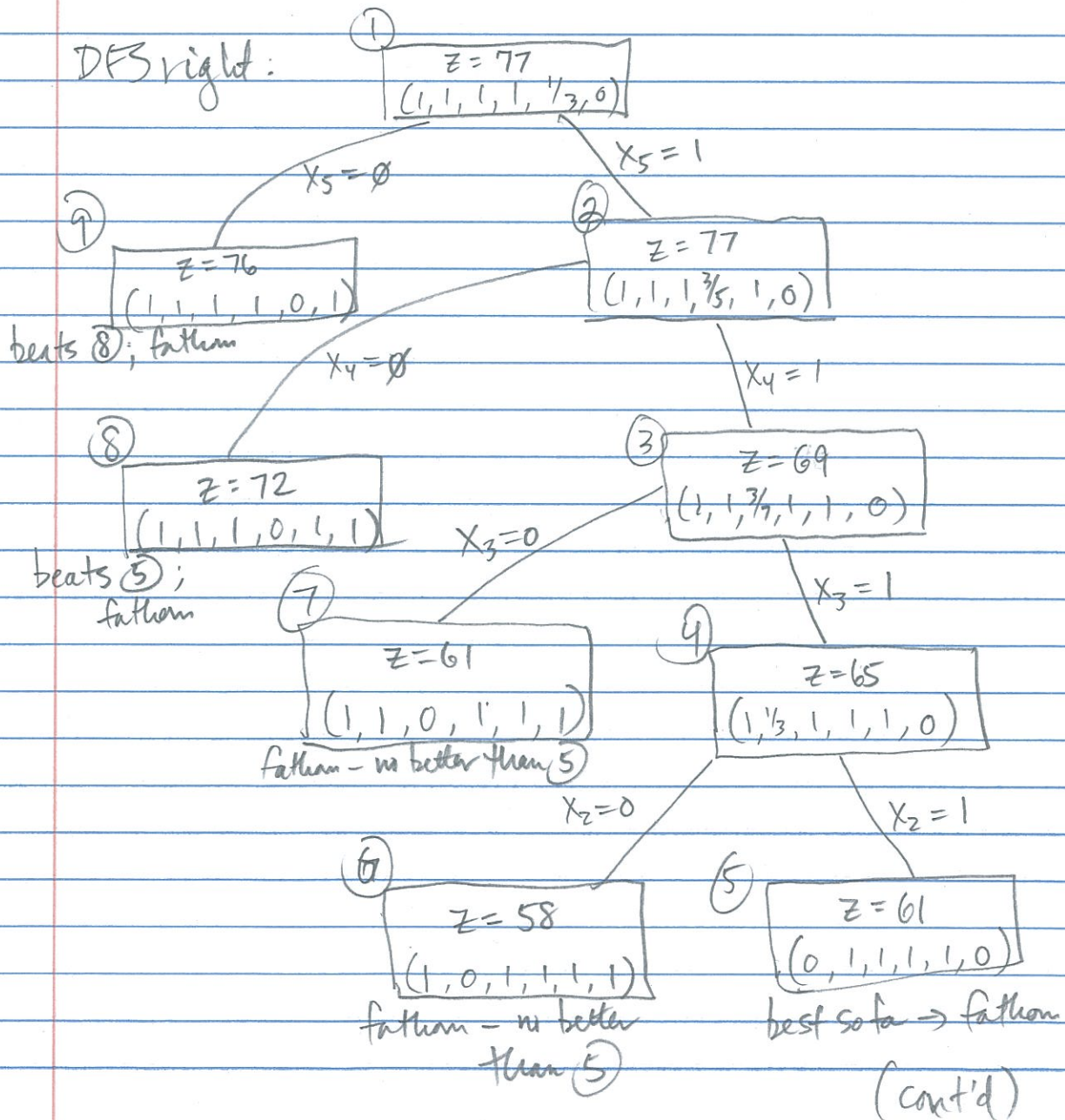
$x_2 \geq 3$

$$\begin{aligned} z^* &= 14 \\ x^* &= (2,2) \end{aligned}$$

Question 1 Solve using branch-and-bound, once using DFS-right, and once using best-choose.

$$\begin{aligned} \max \quad & 20x_1 + 24x_2 + 21x_3 + 10x_4 + 6x_5 + x_6 \\ \text{s.t.} \quad & 4x_1 + 6x_2 + 7x_3 + 10x_4 + 6x_5 + 2x_6 \leq 29 \\ & x_i \in \{0, 1\} \end{aligned}$$

$$\frac{c_i}{a_i} : [5, 4, 3, 1, 1, \frac{1}{2}]$$



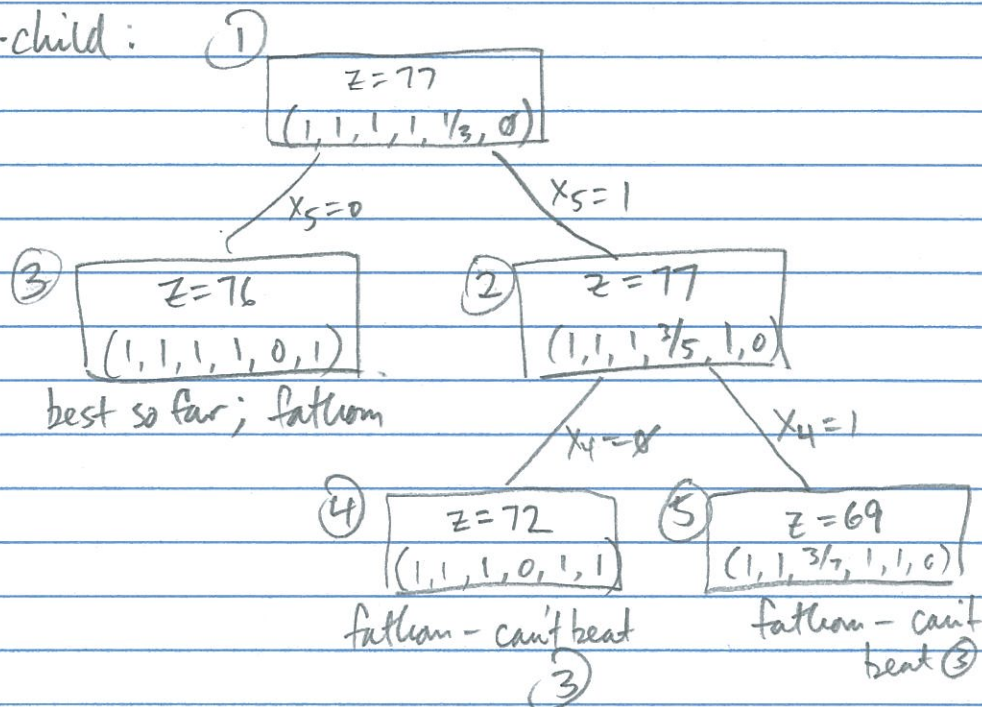


(Easton 1) (cont'd)

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So,  $z^* = 76$ ,  $x^* = (1, 1, 1, 1, 0, 1)$ ,  
found at node ③ via DFS-right.

Best-child:



The fewer nodes evaluated before reaching a feasible integer solution, the sooner we'll be in a position to prune large sections of the search space known to carry solutions inferior to what we've found so far. Our DFS-right search strategy led us to miss what ultimately was the optimum until we had gone fairly deep into the search tree. DFS left, BFS, or best-child in this case would have found an excellent - indeed, optimum - solution early, and obviate exploring many inferior candidates.

1/2

## Ex 2

a) Assume that:

- an IP has a feasible point
- $A$  and  $b$  are rational

Prove that if the LR of the IP is unbounded, then the IP is unbounded.

Let  $\vec{x}$  be a feasible (integer) point of the IP. Then  $\vec{x}$  is also in the feasible region of the LR of the IP.

Since the LR is unbounded, there exists for every feasible point  $\vec{z}$  of the LR a direction  $\vec{d}$  such that

★  $\vec{z} + c\vec{d}$  is also feasible,  $\forall c \in \mathbb{R} \geq 0$

★  $A\vec{d} = \vec{0}$

★  $\vec{d} \geq \vec{0}$

$A$  is rational;  $\vec{0}$  is rational; so  $\vec{d}$  is also rational.

Thus  $\vec{d} = \begin{bmatrix} p_1/q_1 \\ \vdots \\ p_n/q_n \end{bmatrix}$  where  $p_i$  and  $q_i \in \mathbb{Z}^+$ ,  $q_i < \infty$   
 $\forall i \in \{1, \dots, n\}$

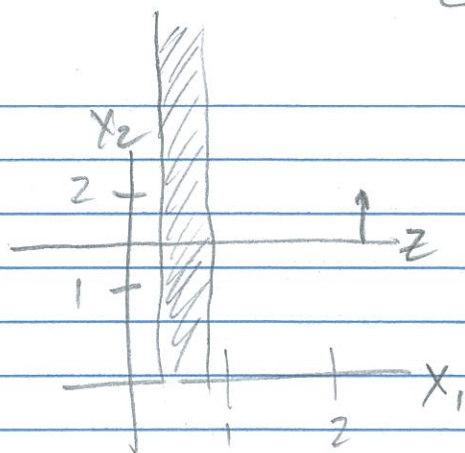
Choose  $c = \text{least common multiple of } \{q_1, \dots, q_n\}$ . Then  $\vec{x} + c\vec{d}$  is also an integer point, and is feasible as shown above. Further, the objective value at  $\vec{x} + c\vec{d} \geq$  obj value at  $\vec{x}$ , since  $c > 0$  and  $\vec{d} \geq \vec{0}$ . So we can continue to find integer points that improve the objective value - hence the IP is unbounded.



Example 2 (a) (cont'd)

However, consider the IP:

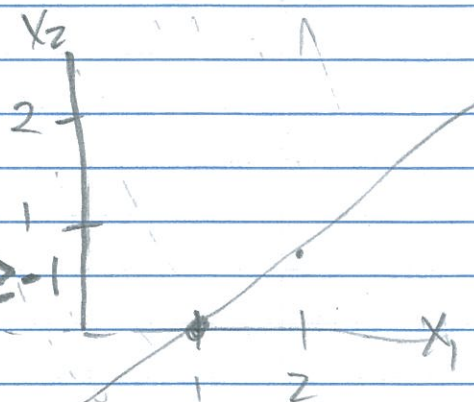
$$\begin{aligned} \max x_2 \\ \text{s.t. } x_1 &\geq 1/4 \\ x_1 &\leq 3/4 \\ x_1, x_2 &\geq 0, x_1, x_2 \in \mathbb{Z}^+ \end{aligned}$$



This IP is infeasible; but its linear relaxation is unbounded.

\* Also consider the IP:

$$\begin{aligned} \max x_1 \\ \text{s.t. } x_1 - \sqrt{2}x_2 &\leq 1; -(x_1 + \sqrt{2}x_2) \leq -1 \\ x_1, x_2 &\geq 0; x_1, x_2 \in \mathbb{Z}^+ \end{aligned}$$



The linear relaxation of this problem is unbounded (make  $x_1$  as large as you like), but the only feasible integer point is  $(1, 0)$ ; hence the IP is bounded at 1.



(b) Example \* satisfies the desired conditions — a feasible integer point exists  $(1, 0)$ ,  $A, b$  contain irrationals; LR unbounded; IP bounded.

(c) Example of  $A \pm b$  rational, LR unbounded, but IP bounded  $\rightarrow$  Example 2a proved the IP must be unbounded if the IP is feasible given the other assumptions; if there is no feasible integer point, the IP certainly isn't bounded. Therefore, I believe no such IP exists.

Any rational will do; irrational \* other  $\rightarrow$  irrational (270)

Question 3 Solve using branch-and-bound:

$$\begin{aligned} \max \quad & 19x_1 + 18x_2 + 16x_3 + 22x_4 + 15x_5 + 17x_6 \\ \text{s.t.} \quad & 4x_1 + 5x_2 + 6x_3 + 10x_4 + 6x_5 + 2x_6 \leq 24 \\ & 9x_1 + 7x_2 + 11x_3 + 8x_4 + 6x_5 + 7x_6 \leq 34 \\ & 8x_1 + 3x_2 + 7x_3 + 4x_4 + 3x_5 + 8x_6 \leq 23 \\ & x_i \in \{0, 1\} \end{aligned}$$

①  $z = 81.53125$   
 $(0.71875, 1, 0, 0.8125, 1, 1)$

$x_1 = 0$

$x_1 = 1$

③  $z \approx 76.548387$   
 $(0, 1, 0.83871, 0.54677, 1, 1)$

②  $z = 81.25$   
 $(1, 1, 0, 0.75, 1, 0.75)$

$x_4 = 0$

$x_4 = 1$

⑤  $z \approx 72.076423$   
 $(1, 1, 0.846154, 0, 1, 0.384615)$

④  $z \approx 80.9285714$   
 $(1, 1, 0, 1, \frac{4}{7}, 0.785714)$

$x_5 = 0$

$x_5 = 1$

⑦  $z \approx 76.64231$   
 $(1, 1, 0.6153846, 1, 0, 0.4615385)$

⑥  $z \approx 78.47059$   
 $(1, 0.470588, 0, 1, 1, 0.82353)$

$x_3 = 0$

$x_3 = 1$

$x_2 = 0$

$x_2 = 1$

⑩  $z = 76$   
 $(1, 1, 0, 1, 0, 1)$

best so far - Pathom

⑪  $z \approx 72 \frac{1}{3}$   
 $(1, 0.761905, 1, 1, 0, 0.045234)$

⑧  $z \approx 73.52941$   
 $(1, 0, 0.470588, 1, 1, 0.5882353)$

⑨ infeasible  
 Pathom

Commentary follows  $\Rightarrow$



### Ex 3 (cont'd)

Generally, using best-child, branching on var furthest from an integer value.

- Node 1, root. Not an integer solution.
- Create nodes 2 and 3, branching on  $x_1$ .
- Node 2 is the better child.
- Create nodes 4 and 5, branching on  $x_4$ .
- Of nodes 3, 4, and 5, 4 is best.
- Create nodes 6 and 7, branching on  $x_5$ .
- Of nodes 3, 5, 6, and 7, 6 is best.
- Create nodes 8 and 9, branching on  $x_2$ .
- Node 9 is infeasible; fathom it right away.
- Of nodes 3, 5, 7, and 8, 7 is best.
- Create nodes 10 and 11, branching on  $x_3$ .
- Node 10 is integer - best so far.
- Nodes 3, 5, 8, and 11 can be fathomed because any integer solutions found by branching will yield  $z$  better than the 76 at Node 10.

So,  $z^* = 76$ ,  $x^* = (1, 1, 0, 1, 0, 1)$ .  $\square$