



Parallel  
Branch and  
Bound to  
solve Mixed  
Integer Linear  
Programs

Chad  
Bohannon,  
Tim Hahn

Introduction

Branch and  
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Parallel Search

Results

References

# Parallel Branch and Bound to solve Mixed Integer Linear Programs

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# Introduction

## Linear Programming

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$$\text{maximize } \sum_{1 \leq j \leq n} c_j x_j \quad (1)$$

$$\text{subject to } \sum_{1 \leq j \leq n} a_{ij} x_j \leq b_j \text{ for } i = 1, 2, \dots, m \quad (2)$$

$$x_j \geq 0 \text{ for } j = 1, 2, \dots, n \quad (3)$$

General form of a Liner Program.



# Introduction

The simplex

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A simplex is solved using pivot points to adjust the coefficients of the optimization function and constraints.

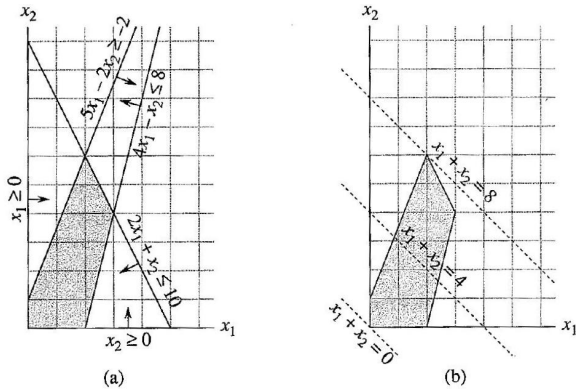


Figure: Geometric view of a simplex.



# Branch and Bound

Solving at each node

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Consider the following:

*maximize:*

$$f = 4x_1 + 11x_2$$

*subject to:*

$$2x_1 - x_2 + x_3 = 4 \quad (4)$$

$$2x_1 + 5x_2 + x_4 = 16 \quad (5)$$

$$-x_1 + 2x_3 + x_5 = 4 \quad (6)$$

$$x_1, x_2, x_3, x_4, x_5 \geq 0 \quad (7)$$



# Branch and Bound

## Integer Constraints

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After the first application of the simplex solver to the problem we get:

$$f = 34\frac{2}{3}, x_1 = \frac{4}{3}, x_2 = \frac{8}{3}$$

To bound the search to the integers, we conduct two sub-searches, one where  $x_1 \leq 1$ , and the other where  $x_1 \geq 2$ .

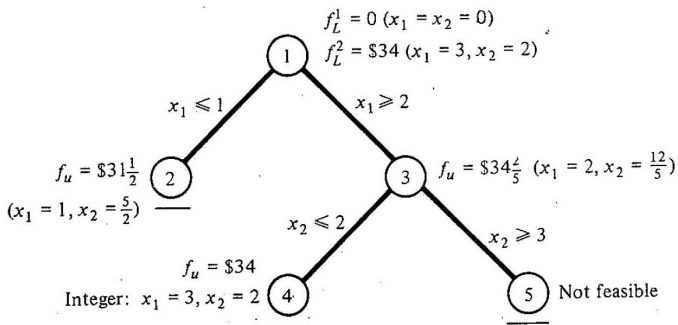
These two searches cover the entire valid solution region, but are not necessarily symmetric.



# Branch and Bound

A complete search tree

The search would look like like:



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# Branch and Bound

A node in the tree

In a single threaded program, each branch is searched in sequence:

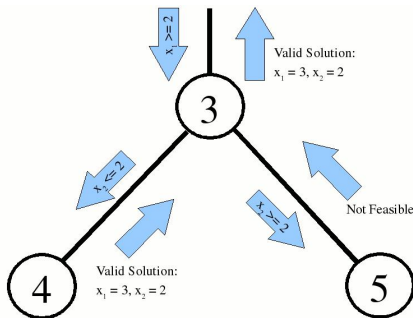


Figure: View of a node in the ILP search space.



# Parallel Search

A node in the tree

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In a multi threaded program, two branches can be search simultaneously:

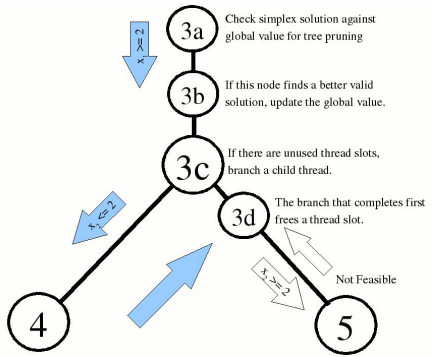


Figure: Branching and joining of parallel searches.





# Results

40 variable problem

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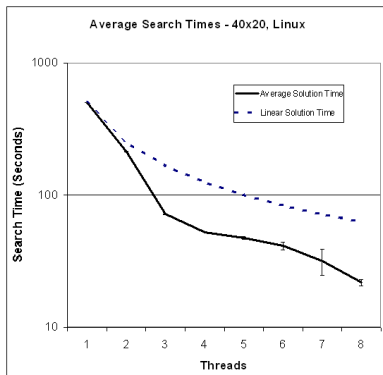
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The following times were observed from a problem with 40 variables and 20 constraints, running on an 8-core Linux machine:

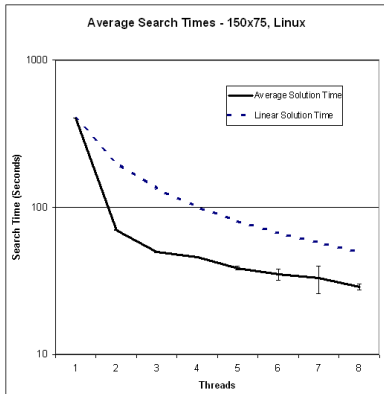




# Results

150 variable problem

The following times were observed from a problem with 150 variables and 75 constraints, running on an 8-core Linux machine:



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