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A HYBRID APPROACH TO MULTI-STAGE LINEAR PROGRAMS.(U)  
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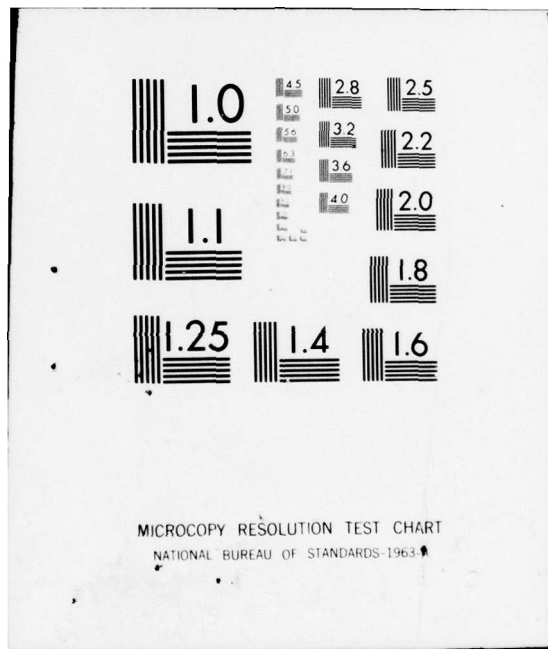
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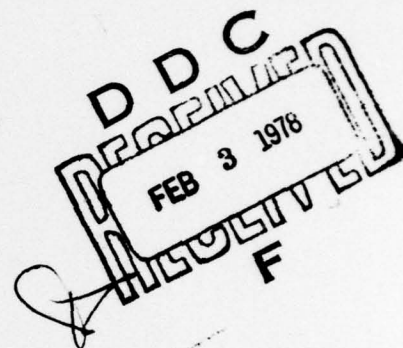
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A HYBRID APPROACH TO MULTI-STAGE LINEAR PROGRAMS

BY

JAMES K. HO and JOHN A. TOMLIN



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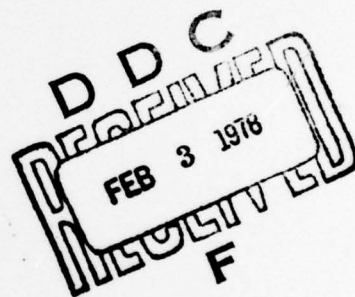
James K. Ho<sup>†</sup> and John A. Tomlin<sup>‡</sup>

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## 1. Introduction

For multi-stage linear programs with the staircase structure it has been observed that a nested decomposition (Staircase) algorithm [2],[3], can become more efficient than a direct Simplex approach. In general this tendency increases with increasing problem size. However, even for smaller problems, the Staircase algorithm usually converges rapidly during Phase 1 and the beginning of Phase 2 before exhibiting a long "tail" towards optimality. This suggests a hybrid algorithm using Staircase initially and then switching to Simplex. Since the Staircase algorithm produces solutions which are in general nonbasic, a special interfacing procedure is required in Simplex to adopt nonbasic starting solutions.

Computational experience indicates that the hybrid algorithm can be an efficient technique for medium size problems.

## 2. The Staircase Algorithm

We consider the linear programming problem of minimizing

$$\sum_{t=1}^T c_t x_t$$

subject to

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$$\begin{aligned}
A_1 x_1 &= d_1 \\
B_{t-1} x_{t-1} + A_t x_t &= d_t, \quad t = 2, \dots, T \\
x_t &\geq 0, \quad t = 1, \dots, T
\end{aligned} \tag{1}$$

where  $c_t$  is  $1 \times n_t$ ,  $x_t$  is  $n_t \times 1$ ,  $A_t$  is  $m_t \times n_t$ ,  $B_t$  is  $m_{t+1} \times n_t$  and  $d_t$  is  $m_t \times 1$  in dimensions.

In [2] and [3], the Staircase algorithm is developed from an application of nested decomposition to (1). The original problem is replaced by a sequence of smaller, independent subproblems coordinated through price and proposal communication (in the sense of Dantzig and Wolfe [1]) between adjacent subproblems. The algorithm seeks an optimal coordination (if one exists) which in turn determines an optimal solution to the original problem.

This is done in three phases. Phase 1 seeks an initial feasible solution to (1) or shows that none exists. Phase 2 seeks an optimal solution to (1) or shows that it is unbounded from below. Throughout Phase 2, primal feasibility is maintained implicitly. A Phase 3 procedure is required to reconstruct a feasible solution. This is normally done at optimality. Dual feasibility is also maintained during Phase 2 so that a lower bound on the objective is available as an optimality criterion.

It has been observed in [3] that relative to a direct simplex approach the Staircase algorithm becomes more efficient with

increasing problem size. However, the threshold problem size differs considerably for different classes of Staircase problems. Moreover, even for smaller problems, the Staircase algorithm usually converges rapidly during Phase 1 and the beginning of Phase 2 before exhibiting a relatively long "tail" of convergence towards optimality.

### 3. A Hybrid Algorithm

The above observation suggests using Staircase to obtain a near-optimal solution and then switching over to Simplex. Hence, a Hybrid algorithm will be:

- Step (i): Phase 1 of Staircase  
until feasibility.
- Step (ii): Phase 2 of Staircase  
until objective is within  $p$  % of  
best lower bound where  $p$  is user supplied.  
( $p=\infty$  implies skipping of Step (ii)).
- Step (iii): Phase 3 of Staircase  
for current feasible solution
- Step (iv): Staircase-Simplex Interface  
from solution in Step (iii) to  
basic feasible solution.
- Step (v): Phase 2 of Simplex.  
until optimality.

Step (iv) is necessary because the solution obtained in Step (iii) is in general nonbasic. The relative amount of work in this extra step determines how well the Hybrid algorithm can combine the advantages of its components.

#### 4. The Staircase-Simplex Interface

Assuming similar data structure for Staircase and Simplex, the actual amount of data transfer required for the switching would be negligible. It remains to start Simplex efficiently given a feasible but generally nonbasic solution.

Procedures for deriving basic feasible solutions from non-basic feasible solutions are not new. In fact such procedures,, usually called 'BASIC', are incorporated in many commercial mathematical programming systems (see e.g. [4]). Furthermore they have been used previously in ad hoc methods to partition structured problems, such as Staircase problems. The general idea is to manually or heuristically partition the right hand side (resource) vector among the submodels (time periods or divisions) which are then solved independently. Assuming a feasible partition was chosen, a non-basic feasible solution will then be available. This non-basic solution (names and values of the variables not at bound, together with bound information) is then used as a starting point for the entire undecomposed problem, and the BASIC procedure

is used to derive a basic feasible solution with at least as good a value as the non-basic solution.

Although the BASIC procedure has been implemented many times, the methodology does not seem to have been published. We therefore give an outline of the method (there are several variations).

Consider the problem of

$$\begin{array}{ll}\text{minimizing} & cx \\ \text{subject to} & Ax=b \\ & x \geq 0\end{array}$$

with  $\bar{x}$  a nonbasic feasible initial solution.

Let  $J = \{j | \bar{x}_j > 0\}$  and set  $x_j, j \in J$  nonbasic at a temporary bound (TB) of  $\bar{x}_j$  with appropriate modification of the right hand side. Then proceed as follows:

Step (0) Start with all logical (or artificial) basis.

Step (1) Stop if  $J = \emptyset$ . Price only  $x_j, j \in J$  for reduced cost  $d_j$ .

Step (2) If  $d_j < 0$ , make  $x_j$  basic by increasing above  $\bar{x}_j$ , i.e. treating TB as a lower bound. If  $d_j \geq 0$ , make  $x_j$  basic by decreasing below  $\bar{x}_j$ , i.e. treating TB as an upper bound.

Step (3) Remove TB for  $x_j$  and  $j$  from  $J$ .

Return to Step (1).

Note that with this procedure the logical basis in Step (0) will be feasible at zero value since  $\bar{x}$  is a feasible solution. Therefore, initially many  $x_j$ ,  $j \in J$  will enter the basis without changing their values from  $\bar{x}_j$ . Much of the computation in pricing and pivot selection can be avoided if we first scan  $J$  and pivot into the basis any  $x_j$  on any row with a nonzero entry in the updated  $x_j$  column and a zero entry in the updated right-hand-side. This "crash" procedure is equivalent to introducing the largest independent subset of  $x_j$ ,  $j \in J$  into the basis before setting the remainder to temporary bounds. Experiments have shown that this is essential to the efficiency of the interface.

## 5. Computational Experience

The experimental codes are written in FORTRAN for the CDC 7600 at Brookhaven National Laboratory. SIMPLEX is based on the revised simplex code LPML with product form of inverse (cf [5]). STAIRCASE is the implementation described in [3], also based on LPML. HYBRID is based on STAIRCASE, SIMPLEX and the interface procedure in Section 4.

Computational experience with three small- to medium-size problems are reported in Tables 1 and 2 and Figure 1. It is observed that HYBRID can be used to combine the advantages of STAIRCASE and SIMPLEX.

## 6. Conclusion

Since the performance of special purpose algorithms is usually highly problem dependent, the flexibility provided by a hybrid algorithm would be useful in a truly versatile Staircase decomposition system. Furthermore, basic solutions are usually preferable from a practical point of view, since fewer activities are "active". The advantage of the hybrid algorithm we propose over the ad hoc use of partitioning and the BASIC procedure, is that the Staircase algorithm appears to be successful in producing good feasible solutions relatively quickly and does not rest on unreliable user partitioning of the problem. Our preliminary computational results would indicate that the hybrid approach may be one of the more successful for the notoriously stubborn class of Staircase models.

| <div> <div>PROBLEM</div> <div>DIMENSIONS</div> </div> | SC205 | SCFXM1 | SCFXM2 |
|-------------------------------------------------------|-------|--------|--------|
| PERIODS                                               | 3     | 4      | 8      |
| ROWS                                                  | 206   | 331    | 661    |
| COLUMNS                                               | 409   | 788    | 1575   |
| NONZEROS                                              | 758   | 2943   | 5890   |
| % DENSITY                                             | 0.90  | 1.13   | 0.57   |

Table 1

Dimensions of Test Problems

| CPU<br>TIME<br>(SEC) |           | PROBLEM | SC205 | SCFXM1 | SCFXM2 |
|----------------------|-----------|---------|-------|--------|--------|
| CODE                 |           |         |       |        |        |
| SIMPLEX              | Phase 1   | 0.00    | 7.91  | 45.65  |        |
|                      | Phase 2   | 3.84    | 3.89  | 29.06  |        |
|                      | Total     | 3.84    | 11.80 | 74.71  |        |
|                      | Relative  | 1.00    | 1.00  | 1.00   |        |
| HYBRID<br><br>p=∞    | STAIRCASE | 1.48    | 4.65  | 14.50  |        |
|                      | INTERFACE | 0.86    | 1.44  | 12.70  |        |
|                      | SIMPLEX   | 0.82    | 3.39  | 41.72  |        |
|                      | Total     | 3.16    | 9.48  | 68.92  |        |
|                      | Relative  | 0.82    | 0.80  | 0.92   |        |
| HYBRID<br><br>p=25   | STAIRCASE | 2.34    | 5.32  | 16.38  |        |
|                      | INTERFACE | 0.92    | 1.06  | 10.27  |        |
|                      | SIMPLEX   | 0.75    | 3.06  | 21.17  |        |
|                      | Total     | 4.01    | 9.44  | 47.82  |        |
|                      | Relative  | 1.04    | 0.80  | 0.64   |        |
| HYBRID<br><br>p=10   | STAIRCASE | 3.01    | 7.64  | 26.11  |        |
|                      | INTERFACE | 0.92    | 1.15  | 10.20  |        |
|                      | SIMPLEX   | 0.84    | 3.01  | 13.42  |        |
|                      | Total     | 4.77    | 11.80 | 49.73  |        |
|                      | Relative  | 1.24    | 1.0   | 0.67   |        |
| STAIRCASE            | Phase 1   | 1.07    | 4.17  | 11.58  |        |
|                      | Phase 2   | 3.92    | 9.04  | 33.98  |        |
|                      | Phase 3   | 0.48    | 1.18  | 2.95   |        |
|                      | Total     | 5.47    | 14.39 | 48.51  |        |
|                      | Relative  | 1.42    | 1.22  | 0.65   |        |

Table 2

Solution Times of the Test Problems

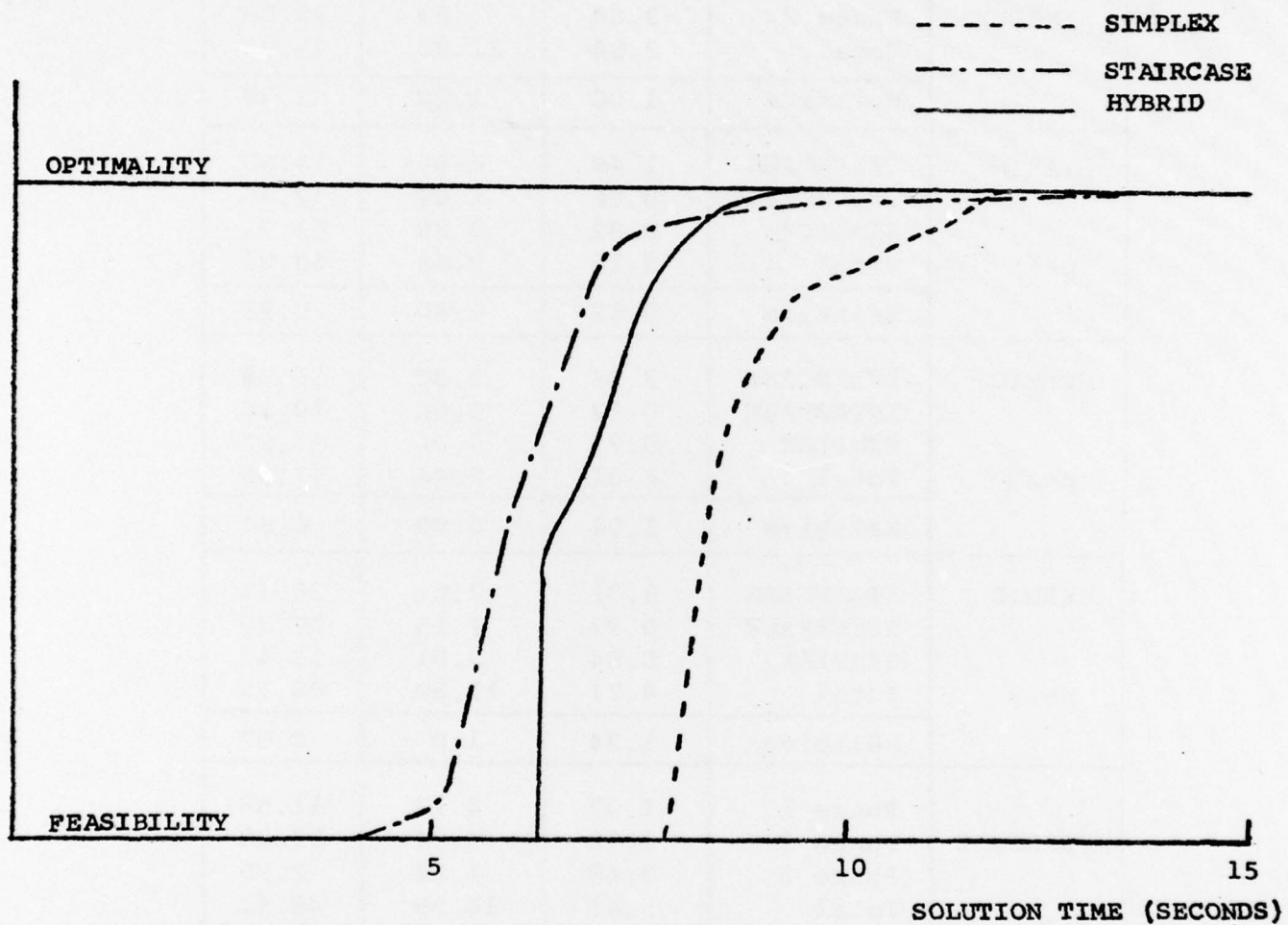


Figure 1. Solution history of Problem SCFXM1.

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- [1] Dantzig, G. B., and P. Wolfe, "Decomposition principle for linear programs", Operations Research 8 (1960), 101-111.
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| 20. ABSTRACT (Continue on reverse side if necessary and identify by block number)<br><br>This paper presents a hybrid algorithm for multi-stage linear programs arising from time-phased or dynamic models. The hybrid computation is based on a nested decomposition algorithm and the revised simplex method. Initial computational experience is reported. |                       |                                                                              |

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