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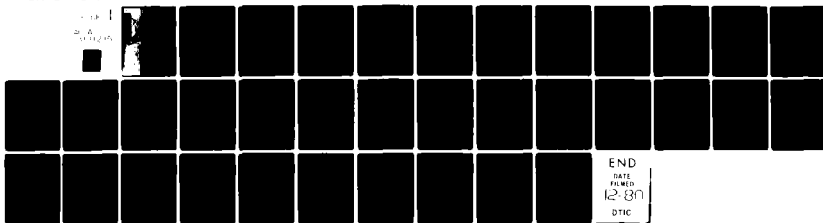
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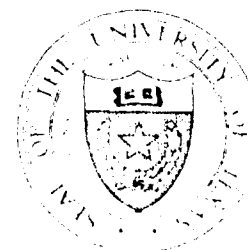
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RECENT DEVELOPMENTS IN COMPUTER  
IMPLEMENTATION TECHNOLOGY FOR  
NETWORK FLOW ALGORITHMS

by

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July 1980

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### ABSTRACT

The application of computer implementation technology to network optimization has brought about unprecedented advances in solution efficiency. The remarkable gains of the early to mid 1970's for solving transportation and transshipment problems are widely known, enabling network codes to out-perform LP codes by two orders of magnitude for these problems. The pioneering study by Gilsinn and Witzgall demonstrated that effective use of computer implementation technology could reduce solution times for shortest path problems from one minute to slightly more than one second, using the same general shortest path algorithm, computer, and compiler.

The momentum launched by these studies has not dwindled, but continues into the present. New advances in all areas of network optimization have recently superseded the procedures previously found to be best. Latest computer implementations clearly outstrip the best codes of the recent past as our understanding of the important relation between algorithmic design and implementation continues to grow.

We undertake to report on some of the major computer implementation studies of the past few years and to present preliminary results on the new developments.

### KEY WORDS

Shortest Path  
Assignment Problems  
Transportation Problems  
Network Flow  
Transshipment Problems

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## INTRODUCTION

The historical development of network algorithms has paralleled and contributed to the growth of an important interface between mathematics and computer science, called *computer implementation technology*. This technology, which started back in 1952 with the implementation of the Stepping Stone Method on the National Bureau of Standards Eastern Automatic Computer, has been recognized only recently as a major discipline in its own right.

Computer implementation technology seeks to determine efficient special procedures for carrying out subalgorithms of a general method on a digital computer by investigating (1) what kinds of information to generate and maintain for executing operations most effectively, (2) which data structures are best to record, access and update this information, and (3) what methods are most suitable for processing these data structures to make the desired information available when it is needed.

To garner such knowledge requires experimentation that artfully blends the best elements of mathematics and computer science. The computer is used both to evaluate the efficiency of resulting algorithmic processes (embodied in executable programs) and to provide statistics about the operation of key components under varying test conditions. Properly generated and utilized, these statistics allow researchers to gain valuable insights on how to improve the design of these components. This iterative modification, integration, and evaluation of key processes is directly analogous to the laboratory

research of other disciplines and leads us to view computer implementation technology as the laboratory research of mathematics and computer science.

The application of computer implementation technology to network optimization has brought about unprecedented advances in solution efficiency. The remarkable gains of the early to mid 1970's for solving transportation and transshipment problems are widely known, enabling network codes to out-perform LP codes by two orders of magnitude for these problems. The pioneering study by Gilsinn and Witzgall demonstrated that effective use of computer implementation technology could reduce solution times for shortest path problems from one minute to slightly more than one second, using the same general shortest path algorithm, computer, and compiler.

The momentum launched by these studies has not dwindled, but continues into the present. New advances in all areas of network optimization have recently superseded the procedures previously found to be best. Latest computer implementations clearly outstrip the best codes of the recent past as our understanding of the important relation between algorithmic design and implementation continues to grow.

We undertake to report on some of the major computer implementation studies of the past few years and to present preliminary results on the new developments.

#### SHORTEST PATH ALGORITHMS

Shortest path analysis (finding the shortest paths from a single node to all other nodes in a directed network unless otherwise specified)

was one of the first network areas to benefit greatly from the application of computer implementation technology [35].

The importance of shortest path solutions in quantitative transportation and communication models has caused a great deal of activity in this area, generating a proliferation of shortest path algorithms in the literature. However, more careful consideration discloses there are only a handful of *general* shortest path methods, each containing a number of *subalgorithms*. These latter are designed to handle special subproblems or sets of operations such as finding the minimum of a set, breaking a loop, reconnecting subtrees, carrying out computations over the nodes and arcs of subtrees, etc.

The many different ways developed to handle these subproblems, unfortunately, have often been referenced as different algorithms rather than as variants of the small class of general algorithms. Contributions toward a unified framework for shortest path algorithms have been made by Denardo and Fox [17], Dial, Glover, Karney, and Klingman [19], Dreyfus [23], and Gilsinn and Witzgall [35].

Gilsinn and Witzgall [35] were the first to conduct an extensive computational study. They found that the Dijkstra algorithm [20], using an address calculation sort proposed by Dial [18], was the most efficient of the methods tested. The subsequent study of [19] evaluated an expanded range of solution procedures and problem structures. This study showed the most efficient method depended on problem topology. For relatively dense random problems, the best implementation of Dijkstra's procedure was dominated by an implementation of Dantzig's algorithm [15]

(using an address calculation sort in both cases). For sparse random and grid problems the best Dantzig implementation was in turn inferior to a label-correcting procedure due to Pape [56] (designed to process a candidate node list from both ends). A by-product of this work was to demonstrate the perhaps surprising result that all of the tested shortest path methods could be interpreted as special variants of the primal simplex method. (Computer listings of the best codes, all in FORTRAN, can be obtained from the authors.)

Sequels to the study of [19] have been undertaken by Klingman, Mote, and Whitman [46], Elam, Klingman, and Mulvey [25], and Klingman and Mulvey [47], extending the best algorithms of [19] to "in-core out-of-core" implementations and mini-computers. The study of Denardo and Fox [17] has further developed new "multiple bucket" algorithms that are projected to be efficient for extremely large problems. The problems tested in their study, however, were solved more efficiently by essentially the same label-correcting procedure found best for sparse random problems in [19]. (Extrapolation of solution times for the multiple bucket algorithms suggest the possibility that the multiple bucket methods may dominate for some larger problem size.)

Another study by Florian, Nguyen, and Pallottino [28] focuses on advanced dual methods for problems of finding shortest paths between all pairs of nodes (in contrast to finding shortest paths from a single source to all others), and reports promising gains in efficiency for these problems. This work provides a method for the "all node pairs" (multiple-origin) problem that is 37% faster than an implementation of



Pape's method [56] applied in iterative fashion over successive origins. It is important to note, however, that the first shortest path problem is solved using an implementation of Pape's method.

The latest advance, still in a developmental stage, is a new label-correcting code by the authors employing a threshold/partitioning scheme for candidate node management. This procedure appears to give it many of the advantages of a label-setting code, yet with greater efficiency than the previously best codes of either the label-setting or label-correcting type.

Preliminary testing on 40 sparse random problems containing 10,000 arcs and 1250 to 2000 nodes yields solution times 36% to 44% faster than the best code, called Pape [56], for these structures.

Table I contains the mean solution times over ten problems for each problem size. Also Table I indicates the number of nodes scanned by the new code, called THRESH. The results show that the number of nodes scanned is only slightly larger than the total number of nodes, which gives an indication of an upper limit on its efficiency. If these results carry over to other problem topologies, they will not only establish the superiority of this new method for single-origin shortest path problems, but also for "all node pairs" shortest path problems approach in [28].

#### ASSIGNMENT PROBLEMS

Assignment problems have had a colorful history. Representing an important special case of the transportation problem, they were among

TABLE I

MEAN SOLUTION TIMES (CPU SECONDS ON A CDC 6400  
USING THE FORTRAN FTN COMPILER) FOR SHORTEST  
PATH PROBLEMS WITH 10,000 ARCS; DISTANCES 1-200.  
(10 Problems were solved for each node size)

| No. of Nodes                   | 2000 | 1667 | 1429 | 1250 |
|--------------------------------|------|------|------|------|
| PAPE                           | 4.2  | 4.7  | 4.9  | 4.7  |
| THRESH                         | 2.7  | 2.8  | 2.7  | 2.9  |
| THRESH<br>No. of Nodes Scanned | 2150 | 1747 | 1511 | 1371 |

the first network problem classes to be considered worthy of investigation in their own right, and a number of different algorithms were proposed for solving them. For a number of years Kuhn's "Hungarian method" [50] was judged to be best, though a specialization of the out-of-kilter method later appeared to provide the best computer times [41]. The first departure from these "classical" approaches occurred with the development of the alternating path basis (AP-AB) primal simplex method for networks [5, 6], which turned out to yield a highly effective specialization for assignment problems. The AP-AB procedure implemented by Barr, Glover, and Klingman [5] appeared to be somewhat faster than the best previous code of [41], and to utilize less memory.

Subsequently, a great deal of new activity has taken place in the assignment area. Hung and Rom [43] developed a "recursive" method for exploiting the AP-AB structure that is twice as fast as the AP-AB code of [5] for totally dense problems. Since the Hung and Rom code was developed for totally dense problems, it is substantially slower than the AP-AB primal simplex code [5] on non-dense problems. (See Table II.)

At about the same time, Weintraub [60] tested an implementation of the Edmonds and Karp assignment procedure that proved still more efficient than the Hung and Rom code. (See Table II.) G. L. Thompson [59] developed a special assignment procedure of yet another type that appears highly promising, but that has not been tested against alternative methods.

TABLE II  
 SOLUTION TIMES IN SECONDS ON A DUAL CYBER 170/175  
 USING THE FTN COMPILER FOR 200 x 200 ASSIGNMENT  
 PROBLEMS WITH COST RANGE 1-100

| CODE                                      | NUMBER OF ARCS |                                  |       |       |       |
|-------------------------------------------|----------------|----------------------------------|-------|-------|-------|
|                                           | 1500           | 2250                             | 3000  | 3750  | 4500  |
| AP-AB<br>(Barr, et al)                    | .483           | .603                             | .634  | .684  | .916  |
| RELAX<br>(Rom-Hung)                       | 1.365          | 1.462                            | 1.168 | 1.054 | 1.157 |
| Dual<br>(Weintraub)                       | .173           | did not<br>achieve<br>optimality | .272  | .291  | .343  |
| SPAN<br>(Engquist)                        | .080           | .175                             | .150  | .282  | .182  |
| PDQIK<br>(Glover, Glover<br>and Klingman) | .065           | .092                             | .107  | .091  | .127  |

\* The times reported in this table are the results of testing conducted by Professor Michael Engquist and not by the authors. We greatly appreciate being permitted to use them.

More recently, a comparative study of assignment methods has been undertaken by Engquist [27]. Engquist has observed that the assignment procedure due to Dinic and Kronrod [22] is similar to the one developed by Hung and Rom [43], though derived from entirely different conceptual bases. The study of Engquist shows that a refined implementation of Dinic and Kronrod's procedure, which is embodied in a code called SPAN, is very efficient. (See Table II.)

Another innovation in assignment solution procedures, which was developed after Hung and Rom's work but before Engquist's work, was motivated by the advance in shortest path methods embodied in the THRESH code. The thresholding and partitioning strategies of THRESH have been extended by F. Glover, R. Glover, and Klingman to accelerate successive optimization steps of a "primal-dual" type of algorithm. Building on refinements in primal-dual methodology due to Ellis Johnson [44] and adding further refinements to capitalize on the THRESH strategies, the resulting assignment procedure, called PDQIK, appears substantially superior even to Engquist's streamlined version of Dinic and Kronrod's method. (See Table II.)

The assignment problems of Table II were generated using NETGEN [49] and the problem specification given in [49] for problems numbered 11-15. (See Table VIII.)

#### MAXIMUM FLOW PROBLEMS

For a number of years the maximum flow network problem has attracted the attention of prominent researchers in network optimization. Since

the ground-breaking work of Ford and Fulkerson, a variety of algorithms featuring good "worst-case" bounds have been proposed for this problem. Surprisingly though, there have been almost no empirical evaluations of these algorithms.

Cheung [11] recently conducted the first significant computational investigation of maximum flow methods, testing several of the major approaches. Although an important step in the right direction, Cheung's implementations employ methodology and data structures originating at least a dozen years ago. That is, the many advances in network implementation technology of the past decade were not incorporated into these codes.

To remedy this situation, Glover, Klingman, Mote, and Whitman [39] tested maximum flow implementations designed to make effective use of the recent developments in network labeling and data organization techniques. To safeguard against being swayed too heavily by preliminary analyses (and past experience in other network settings), the study implemented more than one type of data structure and associated processing techniques for the algorithms tested. Additionally, the resulting codes were tested on four distinct problem topologies.

The investigation included in its examination the two most widely heralded general classes of algorithms for maximum flow network problems--the label tree and referent algorithms. Over 50 codes were developed and at least partially tested for these methods. In the process, a new member of the referent class of algorithms was developed, called the *sub-referent method*, which proved far more effective than all others.

In addition, the study investigated a third type of approach which constitutes a special-purpose variant of the primal simplex method. Previously, researchers had neglected primal methods in favor of more classical labeling types of algorithms, primarily because simple choice rules yield good worst-case bounds for these methods. Recently, Cunningham [12, 13] has partly removed the theoretical bias against primal simplex maximum flow methods by deriving a computational bound for one of its variants (different from the one tested in [39]). Although this theoretical bound is not nearly as good as those for label tree and referent algorithms, practical experience in the network area over the past decade argues strongly for testing a derivative of the primal simplex method, which has proved highly robust and effective in other settings.

The study of [39] tested over twenty implementation variants of the primal simplex method. Independently, Grigoriadis and Hsu [40] recognized the lack of testing in the literature of the primal simplex method on maximum flow problems. Accordingly, they applied a modified version of their code, RNET, designed for solving minimum cost flow problems, and found it surprisingly efficient [40].

Two of the approximately 70 algorithmic implementations of label tree, referent and primal methods tested in [39] stand out far above all the rest. One of these is an implementation of the new sub-referent method which is dramatically faster than all contenders on two of the problem topologies tested. The other method that stands above the rest

of the field is an implementation of a variant of the primal simplex method, called SEQCS, which is fastest on two of the problem topologies and is second in efficiency to the sub-referent method on the other two problem topologies. In addition, the primal simplex variant requires approximately one-third the computer memory required by other algorithms, and lends itself more readily to an efficient in-core out-of-core implementation. A rather surprising result of this study [39] is that even the best label tree codes, which incorporate the "collective wisdom" of many contributors [11, 16, 24, 32, 34] to the original label tree algorithm of Ford and Fulkerson [30], do not compete favorably against either referent or simplex based codes.

The development and testing of Grigoriadis and Hsu [40] of a modified version of RNET on maximum flow problems raises the intriguing question of whether--or to what extent--it is useful to develop fully specialized primal simplex methods for maximum flow problems. Accordingly, we undertook to investigate this issue by testing both specialized and semi-specialized primal simplex codes on the same maximum flow problems, computer, and compiler.

The specialized primal simplex code used in our test is the SEQCS code described in [39] and the semi-specialized primal simplex code is RNET [40] using the maximum flow problem option.\* The tests were conducted on four types of graph topologies: random (R), multi-terminal (MR), transit grid (TG), and hard (H). Tables III, IV, V, and VI con-

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\* We slightly modified RNET to correct an error in its pricing routine for maximum flow problems.



tain the specifications of each topology type, respectively. A description of how these problems were generated is contained in [39].

TABLE III  
RANDOM PROBLEM SPECIFICATIONS

| PROBLEM | N    | A     | ARC<br>CAPACITY RANGE |
|---------|------|-------|-----------------------|
| R1      | 250  | 1250  | 1-100                 |
| R2      | 250  | 1875  | 1-100                 |
| R3      | 250  | 2500  | 1-100                 |
| R4      | 500  | 2500  | 1-100                 |
| R5      | 500  | 3750  | 1-100                 |
| R6      | 500  | 5000  | 1-100                 |
| R7      | 750  | 3750  | 1-100                 |
| R8      | 750  | 5825  | 1-100                 |
| R9      | 750  | 7500  | 1-100                 |
| R10     | 1000 | 5000  | 1-100                 |
| R11     | 1000 | 7500  | 1-100                 |
| R12     | 1000 | 10000 | 1-100                 |

TABLE IV  
MULTI-TERMINAL RANDOM PROBLEM SPECIFICATIONS

| PROBLEM | N *  | A     | AVERAGE NO. OF<br>ARCS INCIDENT<br>ON EACH MASTER<br>SOURCE (TERMINAL) | ARC<br>CAPACITY RANGE** |
|---------|------|-------|------------------------------------------------------------------------|-------------------------|
| MR1     | 250  | 1250  | 5.0                                                                    | 1-100                   |
| MR2     | 250  | 1875  | 7.5                                                                    | 1-100                   |
| MR3     | 250  | 2500  | 10.0                                                                   | 1-100                   |
| MR4     | 500  | 2500  | 5.0                                                                    | 1-100                   |
| MR5     | 500  | 3750  | 7.5                                                                    | 1-100                   |
| MR6     | 500  | 5000  | 10.0                                                                   | 1-100                   |
| MR7     | 750  | 3750  | 5.0                                                                    | 1-100                   |
| MR8     | 750  | 5825  | 7.5                                                                    | 1-100                   |
| MR9     | 750  | 7500  | 10.0                                                                   | 1-100                   |
| MR10    | 1000 | 5000  | 5.0                                                                    | 1-100                   |
| MR11    | 1000 | 7500  | 7.5                                                                    | 1-100                   |
| MR12    | 1000 | 10000 | 10.0                                                                   | 1-100                   |

\*There were five master source nodes and five master terminal nodes.

\*\*Excluding arcs entering or leaving source and terminal nodes.

TABLE V  
TRANSIT GRID PROBLEM SPECIFICATIONS

| PROBLEM | $ N $ * | $ A $ | AVERAGE NO. OF<br>ARCS INCIDENT TO EACH<br>MASTER SOURCE<br>(TERMINAL) | ARC<br>CAPACITY RANGE** |
|---------|---------|-------|------------------------------------------------------------------------|-------------------------|
| TG1     | 235     | 1240  | 40                                                                     | 1-100                   |
| TG2     | 235     | 1640  | 80                                                                     | 1-100                   |
| TG3     | 410     | 2120  | 60                                                                     | 1-100                   |
| TG4     | 410     | 2720  | 120                                                                    | 1-100                   |
| TG5     | 635     | 3200  | 80                                                                     | 1-100                   |
| TG6     | 635     | 4000  | 160                                                                    | 1-100                   |
| TG7     | 910     | 4480  | 100                                                                    | 1-100                   |
| TG8     | 910     | 5480  | 200                                                                    | 1-100                   |

\*Including five master source nodes and five master terminal nodes.

\*\*Excluding arcs entering or leaving master source and master terminal nodes.

TABLE VI  
HARD PROBLEM SPECIFICATIONS

| PROBLEM | N   | A    | ARC<br>CAPACITY RANGE |
|---------|-----|------|-----------------------|
| H1      | 20  | 190  | 1-82                  |
| H2      | 40  | 780  | 1-362                 |
| H3      | 60  | 1770 | 1-782                 |
| H4      | 80  | 3160 | 1-1522                |
| H5      | 100 | 4950 | 1-2402                |

All computer runs were carried out on the Dual CYBER 170/175 using the MNF FORTRAN compiler during periods of comparable computer use. A total of 185 problems were solved. The results, reported in Table VII, provide median solution times for a group of five problems (i.e., five different problems of the same dimension were generated and solved). RNET was run using five different pivot strategies. The pivot strategies tested varied in the arc pricing frequency used for each pass through the arc list. This is controlled by the user supplied parameter, FRQ, in RNET. The heading in Table VII indicates the value used for this parameter (e.g., RNET 1 means FRQ = 1).

TABLE VII  
COMPUTER TIMES\* IN SECONDS FOR MAXIMUM FLOW PROBLEMS  
ON A DUAL CYBER 170/175 USING MNF COMPILER

| PROBLEMS    | SEQCS | RNET 20 | RNET 10 | RNET 5 | RNET 2 | RNET 1 |
|-------------|-------|---------|---------|--------|--------|--------|
| R1          | .04   | .12     | .12     | .12    | .18    | .26    |
| R2          | .07   | .21     | .16     | .17    | .22    | .31    |
| R3          | .08   | .16     | .17     | .18    | .22    | .31    |
| R4          | .07   | .24     | .25     | .27    | .38    | .54    |
| R5          | .16   | .35     | .35     | .34    | .43    | .61    |
| R6          | .24   | .40     | .35     | .35    | .48    | .69    |
| R7          | .12   | .38     | .35     | .42    | .55    | .81    |
| R8          | .22   | .44     | .45     | .46    | .66    | .89    |
| R9          | .40   | .67     | .57     | .60    | .71    | .98    |
| R10         | .21   | .50     | .54     | .53    | .77    | 1.08   |
| R11         | .32   | .65     | .66     | .67    | .89    | 1.18   |
| R12         | .46   | .83     | .78     | .84    | .99    | 1.34   |
| TOTAL       | 2.39  | 4.95    | 4.75    | 4.95   | 6.48   | 9.00   |
| MR1         | .11   | .24     | .20     | .19    | .26    | .36    |
| MR2         | .25   | .50     | .41     | .39    | .43    | .55    |
| MR3         | .25   | .36     | .36     | .35    | .39    | .49    |
| MR4         | .13   | .33     | .31     | .35    | .39    | .59    |
| MR5         | .38   | .51     | .63     | .44    | .58    | .76    |
| MR6         | .67   | 1.09    | .81     | .72    | .73    | 1.00   |
| MR7         | .30   | .53     | .56     | .46    | .67    | .90    |
| MR8         | .45   | .67     | .57     | .57    | .77    | 1.07   |
| MR9         | 1.11  | 2.45    | 1.50    | 1.33   | 1.22   | 1.52   |
| MR10        | .32   | .82     | .62     | .66    | .89    | 1.24   |
| MR11        | .86   | 1.16    | 1.06    | 1.12   | 1.22   | 1.49   |
| MR12        | 1.67  | 2.14    | 1.89    | 1.64   | 1.43   | 1.73   |
| TOTAL       | 6.50  | 10.80   | 8.92    | 8.22   | 7.76   | 11.70  |
| H1          | .03   | .06     | .06     | .08    | .11    | .17    |
| H2          | .20   | .43     | .45     | .51    | .59    | .87    |
| H3          | .66   | 1.50    | 1.51    | 1.37   | 1.88   | 2.50   |
| H4          | 1.53  | 3.97    | 3.44    | 3.23   | 3.96   | 4.85   |
| H5          | 2.96  | 7.58    | 6.54    | 6.12   | 7.61   | 9.27   |
| TOTAL       | 5.38  | 13.54   | 12.00   | 11.31  | 14.15  | 17.66  |
| TG1         | .09   | .21     | .19     | .24    | .30    | .44    |
| TG2         | .08   | .20     | .18     | .23    | .33    | .46    |
| TG3         | .21   | .39     | .39     | .42    | .56    | .85    |
| TG4         | .18   | .35     | .39     | .40    | .56    | .85    |
| TG5         | .35   | .64     | .64     | .67    | .89    | 1.31   |
| TG6         | .27   | .57     | .58     | .61    | .82    | 1.24   |
| TG7         | .43   | .89     | .88     | .93    | 1.14   | 1.70   |
| TG8         | .51   | .96     | .89     | .99    | 1.25   | 1.93   |
| TOTAL       | 2.12  | 4.21    | 4.14    | 4.49   | 5.85   | 8.78   |
| GRAND TOTAL | 16.39 | 33.50   | 29.81   | 28.97  | 34.24  | 47.14  |

\*Five problems of each type were solved and the solution time reported.

The times in Table VII indicate that SEQCS strictly dominates RNET on all problem topologies. The degree of dominance varies substantially, however. For instance, SEQCS is approximately twice as fast as the best RNET times, RNET 10, on the grid problems, but it is only 20% faster than RNET 2 on the multi-terminal random problems.

Overall SEQCS is approximately 80% faster than the best RNET, RNET 5. Since SEQCS requires less computer memory and its times are notably better, it appears worthwhile developing totally specialized primal simplex codes for applications requiring repeated solution of maximum flow problems.

#### MINIMUM COST FLOW PROBLEMS

All of the problems previously discussed may be viewed as a subclass of the minimum cost flow (MCF) problem class. Since the inception of mathematical programming, this problem class has received considerable attention not only from MCF practitioners and theoreticians, but from practitioners and theoreticians across all fields of mathematical programming.

There are a number of reasons for this interest and we shall not attempt to discuss them in detail. There are, however, two general attributes which summarize many of the reasons.

One, it is a problem class that has been driven in large part by the challenge of practice. Historically, the MCF problem class was one of the first to yield applicable optimization models (e.g., the models of Hitchcock, Kantorovich, Koopmans). Today, the MCF problem

class continues to exhibit an even greater ability to model a variety of important problems. These models motivated the development of the first usable pencil and paper heuristics and optimization algorithms. In an analogous manner, new applications continue to beg the question of improved solution software.

Another attribute is its ability to indicate things to come in other fields. For instance, MCF models were not only among the first models developed but they later helped to open up the area of large-scale optimization modeling. MCF solution algorithms also pioneered the area of computer optimization software with the development of a transportation code on the National Bureau of Standards' Eastern Automatic Computer in 1952. Today MCF algorithms are continuing to lead the way in the development of more efficient computer implementation techniques for many different types of mathematical programming software.

The early algorithmic work of the 1940's and early 50's [14, 15, 42] developed heuristic and/or optimization methods which would now be called "primal simplex" methods. Following this work, a number of non-primal simplex methods were proposed including out-of-kilter, dual simplex, and others [2, 10, 32, 33].

As these later methods came along a belief developed that the primal simplex method was not an efficient solution procedure for the MCF problem class. By the mid-60's it was felt that the out-of-kilter method was the most viable approach. This belief also led to the

development of a number of specialized out-of-kilter variants for different subclasses of the MCF problem class.

It is interesting to note that this belief ignored the proposals of Glickman, L. Johnson, and Eselson [36] and E. Johnson [44] for improving the way in which the steps of the primal simplex methods are performed. Many of these proposals are embodied in contemporary implementations of the primal simplex algorithm for the MCF problem.

Contemporary MCF software development began in 1970 with the studies by Barr, Glover, and Klingman [4], Glover, Karney, and Klingman [37], Glover, Karney, Klingman, and Napier [38], Klingman, Napier, and Stutz [49], and Srinivasan and Thompson [58]. This work broke with the past in that:

1. Larger and standardized test problems were established [49].
2. Contemporary computer science methodologies were employed.
3. Primal simplex codes as well as others were developed and evaluated using the same computer and compiler.

The first comprehensive algorithm comparisons were done by [37, 38, 49] who compare out-of-kilter and primal simplex codes on a diverse set of test problems. These studies showed that the primal simplex method is substantially superior to the out-of-kilter method. The success of the primal simplex method was later independently verified by experiments [1, 3, 8, 9, 40, 48, 51, 53, 54, 55].

In addition to verifying the efficiency of the primal simplex method, these later studies proposed alternative pivot strategies and data structures that were embodied in new codes.



Two of these codes, GNET [9] and RNET [40], have received considerable attention due to their reported computational enhancements. For instance, these studies [9, 40] without comparing directly on the same computer and compiler, but running on the same problems, each claim ([9, p. 22-23] and [40, p. 18]) that their respective codes are substantially more efficient than other implementations of the primal simplex method.

These claims stimulated us to conduct a test comparing these codes to previously published results. Thus, in June 1979 we tested PNET-I [37], ARC-II [8], GNET [9], and RNET (version 3.4 [40] on the CDC 6600 at the University of Texas using the FORTRAN MNF compiler and the same test problems [8, 9, 37, 40]. (See Table VIII for NETGEN problem specifications.)

The results of this test, which are contained in Table IX, indicate that PNET-I and GNET are comparable in solution speed but inferior to ARC-II and RNET and that ARC-II and RNET are comparable in solution speed. PNET-I requires the least computer memory followed by ARC-II, GNET, and RNET, respectively.

The most important point to be gleaned from this study is that computer efficiency conversion factors are not sufficiently accurate and should not be used to make code comparisons. The studies [9, 40], each of whom claimed computations superior, made this claim on the basis of computer efficiency conversion factors.

In May 1980, Glover, Klingman, Mead, and Mote initiated a study to integrate and extend the collective ideas of the 70's on MCF software development. This study is not completed due to the massive number of

TABLE VIII

## PROBLEM SPECIFICATIONS

| Number<br>of Nodes | Number of<br>Sources | Number<br>of Sinks | Number<br>of Arcs | Cost |     | Total<br>Supply | Transshipments |      | Percent of<br>High Cost | Percent of Arco<br>Capacitated | Upper Bound Range |         | Random<br>No. Seed |
|--------------------|----------------------|--------------------|-------------------|------|-----|-----------------|----------------|------|-------------------------|--------------------------------|-------------------|---------|--------------------|
|                    |                      |                    |                   | Min  | Max |                 | Source         | Sink |                         |                                | Min               | Max     |                    |
| 1. 200             | 100                  | 100                | 1300              | 1    | 100 | 100,000         | 0              | 0    | 0                       | 0                              | 0                 | 0       | 13502460           |
| 2. 200             | 100                  | 100                | 1500              | 1    | 100 | 100,000         | 0              | 0    | 0                       | 0                              | 0                 | 0       | 13502460           |
| 3. 200             | 100                  | 100                | 2000              | 1    | 100 | 100,000         | 0              | 0    | 0                       | 0                              | 0                 | 0       | 13502460           |
| 4. 200             | 100                  | 100                | 2200              | 1    | 100 | 100,000         | 0              | 0    | 0                       | 0                              | 0                 | 0       | 13502460           |
| 5. 200             | 100                  | 100                | 2700              | 1    | 100 | 100,000         | 0              | 0    | 0                       | 0                              | 0                 | 0       | 13502460           |
| 6. 200             | 150                  | 150                | 3150              | 1    | 100 | 150,000         | 0              | 0    | 0                       | 0                              | 0                 | 0       | 13502460           |
| 7. 300             | 150                  | 150                | 4500              | 1    | 100 | 150,000         | 0              | 0    | 0                       | 0                              | 0                 | 0       | 13502460           |
| 8. 300             | 150                  | 150                | 5155              | 1    | 100 | 150,000         | 0              | 0    | 0                       | 0                              | 0                 | 0       | 13502460           |
| 9. 300             | 150                  | 150                | 6075              | 1    | 100 | 150,000         | 0              | 0    | 0                       | 0                              | 0                 | 0       | 13502460           |
| 10. 300            | 150                  | 150                | 6300              | 1    | 100 | 150,000         | 0              | 0    | 0                       | 0                              | 0                 | 0       | 13502460           |
| 11. 400            | 200                  | 200                | 1500              | 1    | 100 | 200             | 0              | 0    | 0                       | 0                              | 0                 | 0       | 13502460           |
| 12. 400            | 200                  | 200                | 2250              | 1    | 100 | 200             | 0              | 0    | 0                       | 0                              | 0                 | 0       | 13502460           |
| 13. 400            | 200                  | 200                | 3000              | 1    | 100 | 200             | 0              | 0    | 0                       | 0                              | 0                 | 0       | 13502460           |
| 14. 400            | 200                  | 200                | 3750              | 1    | 100 | 200             | 0              | 0    | 0                       | 0                              | 0                 | 0       | 13502460           |
| 15. 400            | 200                  | 200                | 4500              | 1    | 100 | 200             | 0              | 0    | 0                       | 0                              | 0                 | 0       | 13502460           |
| 16. 400            | 8                    | 60                 | 1306              | 1    | 100 | 400,000         | 0              | 0    | 30.                     | 20.                            | 16,000            | 30,000  | 13502460           |
| 17. 400            | 8                    | 60                 | 2443              | 1    | 100 | 400,000         | 0              | 0    | 30.                     | 20.                            | 16,000            | 30,000  | 13502460           |
| 18. 400            | 8                    | 60                 | 1306              | 1    | 100 | 400,000         | 0              | 0    | 30.                     | 20.                            | 20,000            | 120,000 | 13502460           |
| 19. 400            | 8                    | 60                 | 2443              | 1    | 100 | 400,000         | 0              | 0    | 30.                     | 20.                            | 20,000            | 120,000 | 13502460           |
| 20. 400            | 8                    | 60                 | 1416              | 1    | 100 | 400,000         | 5              | 50   | 30.                     | 40.                            | 16,000            | 30,000  | 13502460           |
| 21. 400            | 8                    | 60                 | 2836              | 1    | 100 | 400,000         | 5              | 50   | 30.                     | 40.                            | 16,000            | 30,000  | 13502460           |
| 22. 400            | 8                    | 60                 | 1416              | 1    | 100 | 400,000         | 5              | 50   | 30.                     | 40.                            | 20,000            | 120,000 | 13502460           |
| 23. 400            | 8                    | 60                 | 2836              | 1    | 100 | 400,000         | 5              | 50   | 30.                     | 40.                            | 20,000            | 120,000 | 13502460           |
| 24. 400            | 4                    | 12                 | 1382              | 1    | 100 | 400,000         | 0              | 0    | 30.                     | 80.                            | 16,000            | 30,000  | 13502460           |
| 25. 400            | 4                    | 12                 | 2676              | 1    | 100 | 400,000         | 0              | 0    | 30.                     | 80.                            | 16,000            | 30,000  | 13502460           |
| 26. 400            | 4                    | 12                 | 1382              | 1    | 100 | 400,000         | 0              | 0    | 30.                     | 80.                            | 20,000            | 120,000 | 13502460           |
| 27. 400            | 4                    | 12                 | 2676              | 1    | 100 | 400,000         | 0              | 0    | 30.                     | 80.                            | 20,000            | 120,000 | 13502460           |
| 28. 1000           | 50                   | 50                 | 2900              | 1    | 100 | 1,000,000       | 0              | 0    | 0                       | 0                              | 0                 | 0       | 13502460           |
| 29. 1000           | 50                   | 50                 | 3400              | 1    | 100 | 1,000,000       | 0              | 0    | 0                       | 0                              | 0                 | 0       | 13502460           |
| 30. 1000           | 50                   | 50                 | 4400              | 1    | 100 | 1,000,000       | 0              | 0    | 0                       | 0                              | 0                 | 0       | 13502460           |
| 31. 1000           | 50                   | 50                 | 4800              | 1    | 100 | 1,000,000       | 0              | 0    | 0                       | 0                              | 0                 | 0       | 13502460           |
| 32. 1500           | 75                   | 75                 | 4342              | 1    | 100 | 1,500,000       | 0              | 0    | 0                       | 0                              | 0                 | 0       | 13502460           |
| 33. 1500           | 75                   | 75                 | 4385              | 1    | 100 | 1,500,000       | 0              | 0    | 0                       | 0                              | 0                 | 0       | 13502460           |
| 34. 1500           | 75                   | 75                 | 5107              | 1    | 100 | 1,500,000       | 0              | 0    | 0                       | 0                              | 0                 | 0       | 13502460           |
| 35. 1500           | 75                   | 75                 | 5730              | 1    | 100 | 1,500,000       | 0              | 0    | 0                       | 0                              | 0                 | 0       | 13502460           |

TABLE IX

SOLUTION TIMES IN SECONDS ON A  
CDC 6600 USING MNF FORTRAN COMPILER

| PROBLEMS | ARC-II      | GNET         | PNET-I       | RNET (version 3.4) |
|----------|-------------|--------------|--------------|--------------------|
| 1        | .78         | 1.47         | 1.07         | 1.09               |
| 2        | .89         | 1.48         | 1.25         | 1.07               |
| 3        | 1.01        | 2.06         | 1.64         | 1.11               |
| 4        | .95         | 1.88         | 1.27         | 1.19               |
| 5        | 1.25        | 2.09         | 1.63         | 1.34               |
| 6        | 2.11        | 3.27         | 2.86         | 2.11               |
| 7        | 2.23        | 4.16         | 3.37         | 2.46               |
| 8        | 2.99        | 5.08         | 4.10         | 3.27               |
| 9        | 2.99        | 5.15         | 4.15         | 3.51               |
| 10       | 4.02        | 6.00         | 5.27         | 4.43               |
| 11       | 1.92        | 2.23         | 2.31         | 1.91               |
| 12       | 2.36        | 2.97         | 3.71         | 2.46               |
| 13       | 3.13        | 4.07         | 3.47         | 3.26               |
| 14       | 2.96        | 4.62         | 3.44         | 3.33               |
| 15       | 3.12        | 5.47         | 4.79         | 3.62               |
| 16       | 1.38        | 1.90         | 2.15         | 1.75               |
| 17       | 1.87        | 2.32         | 2.60         | 1.69               |
| 18       | 1.26        | 1.86         | 1.70         | 1.72               |
| 19       | 1.72        | 2.31         | 2.40         | 1.78               |
| 20       | 1.28        | 1.79         | 2.47         | 1.71               |
| 21       | 1.83        | 2.51         | 2.46         | 1.97               |
| 22       | 1.26        | 1.86         | 2.01         | 1.58               |
| 23       | 1.67        | 2.26         | 2.74         | 1.68               |
| 24       | 1.52        | 2.48         | 2.91         | 1.61               |
| 25       | 1.83        | 2.80         | 3.96         | 2.11               |
| 26       | 1.08        | 1.88         | 4.05         | 1.41               |
| 27       | 1.62        | 2.43         | 4.21         | 1.68               |
| 28       | 4.40        | 5.93         | 5.37         | 3.72               |
| 29       | 4.87        | 6.26         | 6.25         | 4.15               |
| 30       | 4.88        | 6.85         | 7.90         | 4.68               |
| 31       | 5.68        | 7.23         | 7.58         | 4.92               |
| 32       | 7.42        | 11.47        | 11.73        | 6.29               |
| 33       | 7.82        | 12.61        | 15.95        | 6.57               |
| 34       | 8.21        | 12.12        | 13.76        | 7.56               |
| 35       | <u>8.81</u> | <u>13.46</u> | <u>15.87</u> | <u>8.11</u>        |
| TOTAL    | 103.12      | 154.33       | 162.40       | 102.85             |

start, pivot, and data structure options to be investigated.

Preliminary results on a new code, called ARCNET, are very encouraging, however. Table X indicates a comparison of PNET-I, GNET, RNET (version 3.6) (using different pivot strategies), and ARCNET on the widely used NETGEN [49] problems of the 70's. (See Table VIII.) The times reported for ARCNET are based on using the same start and pivot criteria for all problems. Moreover, due to human time limitations this is the only start and pivot strategy which has been tested in ARCNET. The heading for RNET indicates the value used for the frequency (FRQ) parameter. (That is, RNET 5 indicates that the value of the FRQ was set to 5.)

The data in Table X have been divided into the four parts, problems 1-10 which are transportation problems, problems 11-15 which are assignment problems, problems 16-27 which are capacitated transshipment problems, and problems 28-35 which are large transportation and transshipment problems. Subtotals are provided for each problem class.

There are a number of interesting observations concerning these subtotals:

1. On transportation problems (problems 1-10) ARCNET is slightly faster than the best RNET times. All codes are substantially faster than GNET. Although ARCNET is the fastest code on these problems, it makes substantially more pivots than PNET-I and GNET.

2. The results on assignment problems (problems 11-15) are similar to those for transportation problems. ARCNET gains in superiority over the other codes and again GNET is substantially slower than all

TABLE X

SOLUTION TIMES IN SECONDS AND NUMBER OF PIVOTS ON  
DUAL CYBER 170/175 USING FRN PORTMAN COMPILER

| CODE:       | PNET-1    |               | CNET      |               | ARCNET    |               | RNET 10   |               | RNET 5    |               | RNET 2    |               | RNET 1    |               | RNET 0.5  |               |
|-------------|-----------|---------------|-----------|---------------|-----------|---------------|-----------|---------------|-----------|---------------|-----------|---------------|-----------|---------------|-----------|---------------|
| Problem No. | Sol. Time | No. of Pivots | Sol. Time | No. of Pivots | Sol. Time | No. of Pivots | Sol. Time | No. of Pivots | Sol. Time | No. of Pivots | Sol. Time | No. of Pivots | Sol. Time | No. of Pivots | Sol. Time | No. of Pivots |
| 1           | .30       | 374           | .42       | 339           | .25       | 526           | .48       | 896           | .38       | 649           | .39       | 540           | .36       | 396           | .47       | 362           |
| 2           | .31       | 364           | .45       | 342           | .26       | 529           | .65       | 1126          | .43       | 752           | .38       | 501           | .41       | 424           | .48       | 365           |
| 3           | .41       | 368           | .60       | 378           | .40       | 735           | .78       | 1345          | .59       | 964           | .46       | 624           | .56       | 501           | .58       | 421           |
| 4           | .51       | 502           | .67       | 392           | .46       | 774           | .81       | 1343          | .64       | 1017          | .47       | 612           | .51       | 524           | .67       | 466           |
| 5           | .52       | 453           | .79       | 413           | .50       | 832           | .82       | 1445          | .69       | 1059          | .57       | 731           | .54       | 541           | .77       | 540           |
| 6           | .85       | 792           | 1.10      | 555           | .78       | 1204          | 1.42      | 2107          | 1.11      | 1559          | .78       | 961           | .86       | 850           | .99       | 695           |
| 7           | 1.18      | 887           | 1.54      | 631           | .98       | 1457          | 1.85      | 2770          | 1.46      | 1974          | 1.07      | 1218          | .97       | 936           | 1.07      | 730           |
| 8           | 1.35      | 827           | 1.56      | 590           | 1.09      | 1472          | 2.11      | 3076          | 1.54      | 2022          | 1.10      | 1250          | 1.15      | 1030          | 1.33      | 861           |
| 9           | 1.10      | 717           | 1.72      | 615           | 1.21      | 1668          | 2.15      | 3192          | 1.81      | 2328          | 1.55      | 1635          | 1.10      | 1089          | 1.42      | 910           |
| 10          | 1.49      | 819           | 2.16      | 689           | 1.31      | 1782          | 2.23      | 3340          | 1.68      | 2214          | 1.53      | 1628          | 1.41      | 1257          | 1.52      | 1006          |
| SUBTOTAL    | 8.02      | 6103          | 11.01     | 4944          | 7.24      | 10979         | 13.30     | 20640         | 10.33     | 14536         | 8.30      | 9700          | 7.87      | 7548          | 9.30      | 6356          |
| 11          | .75       | 1594          | .92       | 800           | .37       | 1428          | .55       | 1792          | .67       | 1861          | .42       | 868           | .56       | 782           | .85       | 745           |
| 12          | .79       | 1582          | 1.05      | 838           | .54       | 1835          | .97       | 2966          | .93       | 2445          | .71       | 1406          | .70       | 996           | .93       | 778           |
| 13          | 1.09      | 1967          | 1.27      | 916           | .75       | 2455          | 1.32      | 4264          | 1.01      | 2890          | .86       | 1711          | .79       | 1021          | 1.21      | 1007          |
| 14          | .97       | 1490          | 1.44      | 898           | .94       | 3127          | 1.51      | 4805          | 1.29      | 3251          | 1.13      | 2180          | 1.15      | 1551          | 1.24      | 1038          |
| 15          | 1.20      | 1784          | 1.85      | 1048          | 1.06      | 3424          | 1.55      | 4711          | 1.68      | 4385          | 1.21      | 2248          | 1.05      | 1319          | 1.42      | 1165          |
| SUBTOTAL    | 4.80      | 8417          | 6.53      | 4500          | 3.66      | 12269         | 5.90      | 18538         | 5.58      | 14838         | 4.33      | 8413          | 4.25      | 5669          | 5.65      | 4733          |
| 16          | .55       | 1173          | .70       | 671           | .29       | 803           | .43       | 990           | .46       | 950           | .49       | 795           | .56       | 640           | .73       | 580           |
| 17          | .78       | 1350          | .83       | 695           | .29       | 839           | .61       | 1488          | .46       | 1079          | .45       | 727           | .56       | 648           | .76       | 606           |
| 18          | .45       | 931           | .67       | 692           | .26       | 765           | .43       | 925           | .45       | 946           | .48       | 782           | .56       | 637           | .73       | 584           |
| 19          | .64       | 1342          | .78       | 698           | .25       | 791           | .53       | 1301          | .51       | 1161          | .50       | 789           | .65       | 723           | .78       | 584           |
| 20          | .53       | 1099          | .64       | 655           | .29       | 708           | .43       | 930           | .43       | 906           | .50       | 737           | .59       | 634           | .85       | 585           |
| 21          | .94       | 1702          | .79       | 621           | .30       | 987           | .59       | 1507          | .61       | 1379          | .65       | 1062          | .60       | 722           | .78       | 593           |
| 22          | .54       | 1173          | .64       | 643           | .29       | 736           | .42       | 908           | .41       | 798           | .46       | 661           | .59       | 619           | .78       | 569           |
| 23          | .70       | 1322          | .75       | 618           | .35       | 984           | .46       | 1275          | .47       | 1072          | .47       | 803           | .52       | 618           | .71       | 535           |
| 24          | .45       | 1227          | .62       | 665           | .23       | 833           | .50       | 1329          | .49       | 1080          | .46       | 800           | .62       | 770           | .87       | 704           |
| 25          | .84       | 2048          | .83       | 732           | .49       | 1653          | .62       | 1859          | .66       | 1639          | .74       | 1406          | .87       | 1101          | 1.27      | 932           |
| 26          | .39       | 1103          | .59       | 599           | .20       | 720           | .36       | 926           | .33       | 729           | .41       | 676           | .46       | 549           | .72       | 533           |
| 27          | .73       | 1747          | .92       | 829           | .38       | 1330          | .45       | 1400          | .50       | 1289          | .50       | 931           | .65       | 825           | .87       | 690           |
| SUBTOTAL    | 7.54      | 16417         | 8.76      | 8118          | 3.62      | 11148         | 5.83      | 14838         | 5.78      | 13028         | 6.11      | 10169         | 7.23      | 8486          | 9.85      | 7541          |
| 28          | 1.62      | 3039          | 2.09      | 1348          | .73       | 1878          | 1.03      | 2410          | .91       | 1935          | 1.04      | 1566          | 1.26      | 1453          | 1.76      | 1385          |
| 29          | 1.56      | 2927          | 2.40      | 1556          | .81       | 2402          | 1.08      | 2611          | 1.12      | 2377          | 1.16      | 1901          | 1.48      | 1748          | 1.93      | 1488          |
| 30          | 2.11      | 4108          | 2.89      | 1842          | .85       | 2578          | 1.53      | 3862          | 1.24      | 2609          | 1.16      | 1933          | 1.48      | 1823          | 2.02      | 1592          |
| 31          | 1.93      | 3929          | 2.67      | 1682          | .84       | 2685          | 1.68      | 4083          | 1.43      | 3051          | 1.29      | 2100          | 1.38      | 1643          | 1.98      | 1576          |
| 32          | 3.04      | 4948          | 4.67      | 2343          | 1.40      | 3624          | 1.75      | 3707          | 1.89      | 3608          | 1.65      | 2769          | 2.36      | 2629          | 3.02      | 2337          |
| 33          | 2.88      | 4603          | 4.49      | 2344          | 1.48      | 3876          | 1.72      | 3697          | 1.66      | 3229          | 1.99      | 2928          | 2.11      | 2387          | 2.79      | 2158          |
| 34          | 3.07      | 5141          | 4.63      | 2259          | 1.65      | 4100          | 2.01      | 4539          | 2.03      | 4031          | 1.76      | 2717          | 2.03      | 2402          | 3.06      | 2306          |
| 35          | 3.60      | 6031          | 4.88      | 2484          | 1.73      | 4332          | 2.21      | 4859          | 2.11      | 4280          | 2.12      | 3353          | 2.23      | 2690          | 3.28      | 2570          |
| SUBTOTAL    | 19.81     | 34726         | 28.72     | 25858         | 9.49      | 25475         | 13.01     | 29768         | 12.39     | 25120         | 12.17     | 19267         | 14.33     | 16770         | 19.84     | 15402         |
| GRAND TOTAL | 40.17     | 65663         | 55.02     | 32948         | 24.01     | 59871         | 38.04     | 83784         | 34.08     | 77326         | 30.91     | 47545         | 33.68     | 38473         | 44.64     | 34032         |

other codes. The number of pivots made by ARCNET as compared to the other codes has increased percentagewise. (In order to gain some idea of the advantage of developing specialized algorithms for the assignment problem, the reader may find it interesting to compare the times in Tables II and X. The assignment problems, computer, and compiler are the same.)

3. On the capacitated transshipment problems (problems 16-27), ARCNET performs extremely well as compared to the other codes being approximately 60% faster than the closest competitor, RNET 5.

4. On the large problems (problems 28-35), ARCNET is again faster being approximately 30% faster than the next closest times of RNET 2.

The total solution times indicate that ARCNET is the fastest followed by RNET 2. This is somewhat surprising given that the start and pivot strategies of ARCNET have not been tuned. Another surprising result is that PNET-I is much faster than GNET on the Dual CYBER 170/175 using the FTN FORTRAN compiler since on the CDC 6600 using the MNF FORTRAN compiler (see Table IX) they are approximately equal. This illustrates again the importance of conducting tests on the same computer and compiler.

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| 13. ABSTRACT<br>The application of computer implementation technology to network optimization has brought about unprecedented advances in solution efficiency. The remarkable gains of the early to mid 1970's for solving transportation and transshipment problems are widely known, enabling network codes to out-perform LP codes by two orders of magnitude for these problems. The pioneering study by Gilsinn and Witzgall demonstrated that effective use of computer implementation technology could reduce solution times for shortest path problems from one minute to slightly more than one second, using the same general shortest path algorithm, computer, and compiler.<br><br>The momentum launched by these studies has not dwindled, but continues into the present. New advances in all areas of network optimization have recently superseded the procedures previously found to be best. Latest computer implementations clearly outstrip the best codes of the recent past as our understanding of the important relation between algorithmic design and implementation continues to grow.<br><br>We undertake to report on some of the major computer implementation studies of the past few years and to present preliminary results on the new developments. |  |                                                                                           |                       |

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