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THE BRADFORD METHOD FOR THE ASSIGNMENT PROBLEM

by C.Mack, Institute of Technology, Bradford.

Summary: This method is at once simpler and faster than any previously propounded method. It can be taught to unskilled personnel (the ability to add and subtract is needed), at the same time it needs less and much easier programming, is much quicker, and is always certain of success when used on digital computers.

Also given is a proof that such methods as have been proposed for the 2-dimensional problem will not succeed with the 3-dimensional allocation problem. Finally, methods of finding the 2nd, 3rd, etc., best solution for the 2-dimensional problem are given.

1. INTRODUCTION

The assignment (or 'allocation' or 'optimal assignment') problem is this: Given an $n \times n$ square array of numbers a_{ij} , define a 'possible' set as the set

$$a_{1,k_1}, a_{2,k_2}, \dots, a_{n,k_n} \quad 1.1$$

where k_1, k_2, \dots, k_n is a permutation of $1, 2, \dots, n$. Then find that possible set which has the minimum sum (or in some cases the maximum sum). We shall call such sets 'minimal' or 'maximal'. Note that the set 1.1 consists of one element from each row but that no two of them are in the same column (hence, since there are n of them they must be in separate columns). An example of a possible set is the set of diagonal elements i.e. $a_{11}, a_{22}, \dots, a_{nn}$.

The assignment problem may arise in many practical situations. One simple example is the allocation of n jobs to n workers whose rate of production for each job is known. The optimal allocation gives the maximum rate of production. The problem has arisen in the radar systems now being developed to control the large numbers of aircraft expected to be flying simultaneously within a few years. The Royal Radar Establishment has, after careful consideration, adopted the Bradford method (see Magowan, 1965). Other organisations are adopting it (or so I believe).

Easterfield (1946 and 1961) put forward a method which the Bradford method resembles in many respects, but the latter is very much quicker. Kuhn (1955) gave a 'Hungarian' method based on existence theorems by Hungarian mathematicians. However, his method is only practicable on an electronic digital computer and requires skilful programming besides taking considerable computer time. Churchman, Ackoff, and Arnoff give a variant of the Hungarian method which is reasonably good for small arrays, but the problem of finding the least number of lines through the zeroes can be quite difficult even for a 6x6 array. (Kuhn's method, in effect, classifies these zeroes in several different classes, finally sorting them out and thus determining the minimum number of lines, but the zeroes have to be examined quite a number of times in this process.)

The Bradford method has none of these disadvantages and the technique described below can be taught to unskilled clerks in half an hour. It or its variant of Section 3 can be easily programmed (full instructions are given in Section 3), and it requires relatively little programming, takes little computer time, and is always certain of success.

The desk form of the method given in Section 2 has a simple check (most important for desk work) and with it a 15x15 array can be done in less (sometimes much less) than an hour.

All methods, directly or indirectly, are based on the observation that, if we add to or subtract from every element in a row (or column) the same amount, we do not alter the positions of the minimal or maximal set. How this is used in the Bradford method we now describe.

2. THE BRADFORD METHOD

2.1 The nature of the basic operations We shall describe the case of finding the minimal set (the finding of the maximal set is described in subsection 2.6). Now in every row there is a minimum element (for that row); though in some rows there may be alternative equal minimum elements. In the Bradford

method we raise (by single column, or two or possibly more) some of the rows. we can select one in each row such that different columns. one such element in form a minimal set consists of one element \geq the sum of the row the same positions required answer.

This raising which are now described

2.2 The operations and an 'alternative underline in each row chosen arbitrarily each underlined element can be seen in array only one base in each some columns and no bases only occupy 3

(a)

	Start of	Step			
1	12	6	25	22	20
2	18	9	18	25	27
3	13	14	21	29	28
8	8	14	21	25	24
11	16	10	22	14	25
9	21	14	12	16	15

We spread each 'step' by the with more than one (every element in) of these bases equal but in the same row 'alternative base' fy this we place a

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method we raise (by the same amount) the elements of a
 single column, or of several columns, so that we form
 two or possibly more alternative minimum elements in
 some of the rows. We keep doing this until finally
 we can select one from the alternative minimum elements
 in each row such that these chosen elements are in
different columns. There must then be one and only
 one such element in each column. These elements must
 form a minimal set because any other possible set
 consists of one element from each row and so its sum
 \geq the sum of the row minima. Finally, the elements in
 the same positions in the original array give the
 required answer.

This raising of columns is done in 'steps'
 which are now described.

2.2 The operations in a 'step': definition of a 'base'
 and an 'alternative base' If it is the first step
 underline in each row the minimum element (or one
 chosen arbitrarily if there are two or more). We call
 each underlined element a 'base'. This underlining
 can be seen in array (a). Note that there is one and
 only one base in each row but there may be several in
 some columns and none in others as in (a) where the
 bases only occupy 3 columns.

	(a)						(b)					
	Start of Step 1						End of Step 1 = Start of 2					
1	12	6	25	22	20	4	12	6	25	22	20	
2	18	9	18	25	27	5	18	9	18	25	27	
3	13	14	21	29	28	6	13	14	21	29	28	
8	8	14	21	25	24	11	8	14	21	25	24	
11	16	10	22	14	25	14	16	10	22	14	25	
9	21	14	12	16	15	12	21	14	12	16	15	

We spread the bases over one more column at
 each 'step' by the following technique: Take a column
 with more than one base (e.g col 1 in (a)) and raise
 (every element in) it by the least amount so that one
 of these bases equals an element in another column
 but in the same row. This other element is then an
 'alternative base' to the original base, and to signi-
 fy this we place a dot under it. Thus if we raise

col 1 of (a) by 3, (when (a) becomes (b)), the original base 9 in row 6 col 1 becomes 12 and equals the 12 in row 6 col 4 (so we place a dot beneath it). Since this alternative base is in a column (col 4) containing no original bases, we stop. We then transfer the base in row 6 from its original position (col 1) to the alternative position (col 4) and thus we have spread the bases over one more column than before. The new base is underlined and the line under the original base is erased (or brackets put around it). The bases then appear as in (b) where they occupy 4 columns as against only 3 in (a). Step 1 has now ended.

The end of any previous 'step' is the start of the next 'step'. Thus we start step 2 with the array (b). Again, we raise col 1 (it has 3 bases), this time by 2, when the base 4 in row 1 becomes 6 and equals the 6 in row 1 col 3. This 6 is now an alternative base and is dotted (see (b)); but we do not show the raised col 1 in (b)). This time, unfortunately, the new alternative base is in a column (col 3) already containing an original base (namely 10 in row 5). So now we raise both col 1 and col 3 by 4. the base in row 5 col 3 now goes from 10 to 14 and equals the element 14 in row 5 col 5 (it is therefore dotted). Since col 5 has no original base we stop. The array is now as in (c), and we are ready to transfer the bases.

(c)
Before Transfer
at End of Step 2

10	12	10	25	22	20
11	18	13	18	25	27
12	13	18	21	29	28
17	8	18	21	25	24
20	16	14	22	14	25
18	21	18	12	16	15

(d)
Diagram showing
Transfer of Bases

(x)	-x	x	x	x	x
x	x	x	x	x	x
x	x	x	x	x	x
x	x	x	x	x	x
x	x	(x)	x	x	x
x	x	x	x	x	x

() means a removed base

→ means a new base

This transfer of bases so as to occupy one more column is shown diagrammatically in (d). Note that in col 3 a base is removed (in row 5) but a new one is formed (in row 1); while col 5 has a new base, and in col 1 one base is removed.

In general a 'step' consists of a number of raising operations. In such an operation the starting

column plus all columns formed previously do least amount required. We stop when the last original base. We occupy one more col

2.3 The Transfer R though it is very ea (d) above). It is

The last formed alt the original base is an alternative " " the original " " an alternative " "

and so on; until a contains other (ori

This succee in a column which h from a column which intermediately have a new base in anothe

Note that n will necessarily ap (g) below); (ii) so alternative bases b above process (this

2.4 The Short Form to add to elements (because addition o So the following Sh confines addition t out all operations

The array (going from (b) to (ations clear. In that are raised in by raising col 1. the bases of col 1 in A is the amount bases then become 6 the element 6 in rc

s (b)), the original d equals the 12 in ath it). Since n (col 4) containing en transfer the base (col 1) to the us we have spread before. The new er the original base t). The bases then 4 columns as against led. tep' is the start of tep 2 with the array as 3 bases), this time omes 6 and equals the an alternative base not show the raised unately, the new col 3) already contain- row 5). So now we the base in row 5 equals the element 14 tted). Since col 5 e array is now as in the bases.

ing
Bases

x x
x x () means a removed base
x x
x x
x x → means a new base
x x

as to occupy one more in (d). Note that in) but a new one is as a new base, and in sts of a number of peration the starting

column plus all columns containing alternative bases formed previously during the step are raised by the least amount required to form a new alternative base. We stop when the latter is in a column containing no original base. We then transfer the bases so that they occupy one more column by the following rule.

2.3 The Transfer Rule We now give this in words, though it is very easily demonstrated graphically (see (d) above). It is

The last formed alternative base is always a new base the original base in the above element's row is removed
an alternative " " " " " col is a new base
the original " " " " " row is removed
an alternative " " " " " col is a new base

and so on; until a base is removed from a column which contains other (original) bases.

This succeeds because (i) a new base is formed in a column which had none before; (ii) a base is removed from a column which had more than one; (iii) columns intermediately have a base removed from one row but have a new base in another row.

Note that not all columns carrying alternatives will necessarily appear in the above transfer (see array (g) below); (ii) some columns may carry two or more alternative bases but only one is selected during the above process (this can be done arbitrarily, see (k)).

2.4 The Short Form Now there is no need, during a step, to add to elements other than the bases in a column (because addition cannot make a non-minimum a minimum). So the following Short Form has been devised which (i) confines addition to essential numbers only, (ii) sets out all operations simply and clearly.

The array (e) below shows the above Step 2 (i.e. going from (b) to (c)) in Short Form and makes its operations clear. In (e) the line C gives the columns that are raised in chronological order. Thus we start by raising col 1. Below the 1 (in line C) we place the bases of col 1 (namely 4,5,6). The first amount in A is the amount by which col 1 is raised. The bases then become 6,7,8 as shown. But the 6 equals the element 6 in row 1 col 3, so a dot is placed under

(e)

Step 2 in Short Form						C: 1	3	5
						A: 2	4	
<u>4</u>	12	<u>6</u>	25	22	20	4	<u>6</u>	10
<u>5</u>	18	9	18	25	27	5	<u>7</u>	11
<u>6</u>	13	14	21	29	28	6	<u>8</u>	12
11	<u>8</u>	14	21	25	24			
14	16	<u>10</u>	22	<u>14</u>	25		10	<u>14</u>
12	21	14	<u>12</u>	16	15			
6 4						:T		

(f)

Transfer of Bases		
(<u>4</u>)	→	<u>6</u> 10
<u>5</u>		<u>7</u> 11
<u>6</u>		<u>8</u> 12
(<u>10</u>)	→	<u>14</u>

both these elements. Since the alternative base is in col 3 then 3 is inserted in line C and the base in col 3 (namely 10 in row 5) is added in the appropriate place below the 3 (in line C). The second amount 4 in line A is that by which both col 1 and col 3 are raised. Their bases now become 10, 11, 12 and 14 (see the last column on the right in (e)). The last element equals the 14 in row 5 col 5 and a dot is placed under both. Since col 5 has no (original) base we stop.

The transfer of bases can then be marked in very simply (it is shown in (f) above, to avoid too much marking of (e), but it would normally be marked on (e)).

After this marking of the transfer, the amount T nominally added to each element of a column during the complete step is totalled and actually added to that column. The rule is this: T = Total amount shown in line A to the right of where the column is mentioned in line C; (thus, for col 3, T = 4; for col 1, T = 4+2 = 6). The bases are then marked in using the markings on the right, and the array is ready to start the next step, (the array resulting from (e) is shown in (g)).

2.5 Further Shortening of the Process If the working is carried out in pencil then the augmented columns which arise from the addition of the T can be written (with the correct bases underlined) next to their original columns and the latter erased. When this has been done the working on the right is erased. This saves having to write out complete arrays (a disadvantage of the Hungarian methods).

Further si
are: (i) prime (or columns being raised not being raised (smallest elements are being raised; would be confusing (ii) the minimum element' and the c on the right gives elements 20, 18, 21, under the 3 in line A value is min{20-

(iii) draw a vertical number appears in seen at a glance) (iv) where and through a primed element in another column

By the full 20x20 arrays can be

(g)

Step 3 in Short Form

10	12	<u>10</u>	25	22	20'
<u>11</u>	18	<u>13</u>	18	25	27
<u>12</u>	13	18	21	29	28
<u>17</u>	<u>8</u>	18	21	25	24
20	16	14	22	<u>14</u>	25
18	21	18	<u>12</u>	16	15
10	9	8	3		

The array (for our illustrative bases shown on the to their columns we there is no need to we are only interested (and (j) shows the However, the final in that they enable

(f)
transfer of
Bases

→ 6 10
 7 11
 8 12

(10) → 14

...tive base is in
 ...the base in col 3
 ...appropriate place
 ...amount 4 in line A
 ...raised. Their
 ...the last column on
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...be marked in very
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 ...fer, the amount T
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 ...col 1, T = 4+2 =
 ...ng the markings
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If the working
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Further simple but valuable time-saving devices
 are: (i) prime (or tick), in each row of the bases of the
 columns being raised, the smallest element in a column
 not being raised (in (g) below, we show the primed
 'smallest elements' at the point where cols 1,2,and 3
 are being raised; the full priming throughout the step
 would be confusing to show)

(ii) the minimum difference between primed 'smallest
 element' and the corresponding (augmented) base value
 on the right gives the A value (thus, with the primed
 elements 20,18,21,21 shown in (g) the augmented bases
 under the 3 in line C are 10,13,14,9, and so the next
 A value is $\min\{20-10,18-13,21-14,21-9\} = 5$)

(iii) draw a vertical line through any column whose
 number appears in line C (columns being raised can then be
 seen at a glance)

(iv) where and only where this vertical line passes
 through a primed element then another 'smallest element'
 in another column must be found .

By the full short technique any 15x15 and some
 20x20 arrays can be solved within an hour.

(g)

Step 3 in Short Form

						C:1	2	3	4	6
						A: 1	1	5	3	
10	12	10	25	22	20'			10	15	18
11	18	13	18	25	27	(11)	12	13	18	21
12	13	18	21	29	28	12	13	14	19	22
17	8	18	21	25	24		8	9	14	17
20	16	14	22	14	25					
18	21	18	12	16	15					(12) → 15
10	9	8	3							:T

The array (g) shows in Short Form, the last step,
 for our illustrative array with the last transfer of
 bases shown on the right. When the T values are added
 to their columns we obtain the array (h). Actually,
 there is no need to add the final step T values because
 we are only interested in the positions of the bases
 (and (j) shows the minimal set for the original array).
 However, the final T-values are themselves of interest
 in that they enable a simple check to be carried out.

(f)
Transfer of
Bases

(4) → 6 10
5 → 7 11
6 → 8 12

(10) → 14

alternative base is in C and the base in col 3 the appropriate place. Second amount 4 in line A col 3 are raised. Their (see the last column on element equals the 14 in under both. Since col

n then be marked in very, to avoid too much, normally be marked on (e). The transfer, the amount T of a column during the actually added to that Total amount shown the column is mentioned = 4; for col 1, T = 4+2 = 6 in using the markings ready to start the next (e) is shown in (g)).

Process If the working the augmented columns which T can be written (with next to their original When this has been done sed. This saves having disadvantage of the

Further simple but valuable time-saving devices are: (i) prime (or tick), in each row of the bases of the columns being raised, the smallest element in a column not being raised (in (g) below, we show the primed 'smallest elements' at the point where cols 1, 2, and 3 are being raised; the full priming throughout the step would be confusing to show)

(ii) the minimum difference between primed 'smallest element' and the corresponding (augmented) base value on the right gives the A value (thus, with the primed elements 20, 18, 21, 21 shown in (g) the augmented bases under the 3 in line C are 10, 13, 14, 9, and so the next A value is $\min\{20-10, 18-13, 21-14, 21-9\} = 5$)

(iii) draw a vertical line through any column whose number appears in line C (columns being raised can then be seen at a glance)

(iv) where and only where this vertical line passes through a primed element then another 'smallest element' in another column must be found.

By the full short technique any 15x15 and some 20x20 arrays can be solved within an hour.

(g)

Step 3 in Short Form

						C: 1	2	3	4	6
						A: 1	1	5	3	
10	12	10	25	22	20'			10	15	18
11	18	13	18	25	27	(11)	12	13	18	21
12	13	18	21	29	28	12	13	14	19	22
17	8	18	21	25	24		8	9	14	17
20	16	14	22	14	25					
18	21	18	12	16	15					(12) → 15
10	9	8	3							:T

The array (g) shows in Short Form, the last step for our illustrative array with the last transfer of bases shown on the right. When the T values are added to their columns we obtain the array (h). Actually, there is no need to add the final step T values because we are only interested in the positions of the bases (and (j) shows the minimal set for the original array). However, the final T-values are themselves of interest in that they enable a simple check to be carried out.

(h)
Final (and Check)

Array					
20	21	<u>18</u>	28	22	20
21	27	21	<u>21</u>	25	27
<u>22</u>	22	26	<u>24</u>	29	28
<u>27</u>	17	26	24	25	24
30	25	22	25	<u>14</u>	25
28	30	26	15	16	<u>15</u>

W: 19 9 12 3 0 0

It is to be noted that in the transfer of bases shown in (g), only 2 out of the 4 alternative bases (shown dotted on the right) appear as new bases. Note also that in the minimal set shown in (j) the two smallest elements 1 and 2 of the array do not appear.

2.6 The Check The line W in (h) gives the sum of the T values added to the columns in the whole process. If these W values are added to the original columns then we should get the final array. If the row minima in this final array are in the positions given by the final step we have made no mistake (not in finding the minimal set; there might be other mistakes but these do not matter).

2.7 The Maximal Set This can be found in exactly the same way as the minimal set except that we underline the row maximum as a base; and in a step we lower those columns which have more than one base to form alternative bases.

In (k) below we show a single step in Short Form.

(k)
A Short Form Step in Finding a Maximal Set

	C: 1	3	6	4	
A:	-2	0	-2	-1	
	24	22	22	20	19
	26	24	24	22	21
		28	28	26	25
			(18) →	<u>16</u>	15
		(21) →	21	19	18
				(19) →	<u>18</u>
T:	-5	-3	-1	-3	

There are some features of col 3 is brought into must be taken to equal 3 in line C on the column on the right simultaneously (1, one and one only of arbitrarily, since which will shorten

3. ALTERNATIVE FOR

3.1 Basic Operatio

grammed without di columns being rais tronic computer, w is perhaps more ea

In this fo each step by selec we lower it by the elements to equal alternative base. a column contain this and the first base; and so on.

step on the array in the previous me occupy one more co

3.2 The Transfer R

The (original) bas an alternative bas the original " an alternative " and so on

until a new base is at the start of the

This succee umn containing the bases removed, into base, and the first

(j)
Minimal Array showing

Minimal Set

6	25	22	20
9	18	25	27
14	21	29	28
14	21	25	24
10	22	14	25
14	12	16	15

transfer of bases shown in
 alternative bases (shown dotted
 lines). Note also that in
 two smallest elements
 are.

gives the sum of the
 the whole process.
 the original columns
 may. If the row minima
 positions given by the
 make (not in finding the
 or mistakes but these do

is found in exactly the
 step that we underline
 in a step we lower those
 a base to form alternative

single step in Short Form.

3	6	4	
0	-2	-1	
2	22	20	19
4	24	22	21
8	28	26	25
(18)	→ 16	15	
21) → 21	19	18	
(19)	→ 18		

There are some features worth noting in (k). (i) When col 3 is brought in, it has two original bases and care must be taken to ensure that both are recorded below the 3 in line C on the right. (ii) In the last but one column on the right two alternative bases have been formed simultaneously (16 and 20); during the transfer of bases one and one only of these has to be selected. We do this arbitrarily, since there is no means of telling beforehand which will shorten the subsequent work.

3. ALTERNATIVE FORM OF BRADFORD METHOD: PROGRAMMING

3.1 Basic Operations The previous method can be programmed without difficulty; but, since addition to the columns being raised presents no difficulty on an electronic computer, we now give an alternative form, which is perhaps more easily programmed.

In this form, to find the minimal set, we start each step by selecting a column containing no bases, and we lower it by the least amount for one of the column's elements to equal a base. This element becomes an alternative base. If the (original) base equalled is in a column containing other bases we stop; if not we lower this and the first column to form another alternative base; and so on. (The result of carrying out such a step on the array (b) is shown in (m) below.) Just as in the previous method we have to transfer the bases to occupy one more column which we do thus:

3.2 The Transfer Rule

The (original) base last equalled is removed
 an alternative base in the above's row is a new base
 the original " " " " col " removed
 an alternative " " " " row " a new base
 and so on
 until a new base is formed in the column first lowered
 at the start of the step.

This succeeds, just as in 2.3, because the column containing the last equalled base has one of its bases removed, intermediate columns lose one and gain one base, and the first column lowered gains one.

3.3 The Programme We need the following quantities during the programme (which is for the minimal set) :

- a_{ij} current value of the element in the i th row and j th column of the array
- n_j the number of bases in the j th column
- b_i the value of the base in the i th row, and
- c_i the number (i.e. the j -value) of its column
- a_i the number of the column containing the alternative base in the i th row (if none, put $a_i = 0$)
- w_1, w_2, \dots, w_k the numbers of the columns being lowered during the k th lowering operation of a step

We commence by finding b_i and c_i for the original array, and from the c_i we find the n_j . We are then ready for step 1. A step is started thus:

- 1) put all $a_i = 0$, and put $w_1 = J =$ first j whose $n_j = 0$. Then we begin the lowering operations. At the k th such operation
- 2) find $M = \min(a_{ij} - b_i)$ for all i whose $a_i = 0$ and for $j = w_1, \dots, w_k$; suppose $i = i', j = j'$ at this minimum
- 3) put $a_{i'} = j'$; subtract M from all a_{ij} for $j = w_1, \dots, w_k$
- 4) if $n_{c_{i'}} = 1$, put $w_{k+1} = c_{i'}$, $k = k+1$, jump to 2)
- 5) if $n_{c_{i'}} > 1$, subtract 1 from $n_{c_{i'}}$, put $n_J = 1$,

Then effect the transfer of bases thus: put $i_t =$ last i' , at the t th transfer

- 6) put $c_{i_t} = a_{i_t}$; if $a_{i_t} = J$ jump to 7), if not find i_{t+1} such that $c_{i_{t+1}} = a_{i_t}$; put $t = t+1$, jump to 6)
- 7) set all $b_i = a_{ij''}$ where $j'' =$ (new) a_i ; jump to 1)

When no $n_j = 0$ (when all n_j should be 1), the $c_i =$ column number of the element of the minimal set in the i th row.

The programme for the maximal set is much the same, though then the b_i are the maxima in their rows, $M = \min(b_i - a_{ij})$, and M is added not subtracted in 3).

We now show some of the details of the working in carrying out a step by the above programme, starting

with the array of

A Step of the Algorithm
Values of t

	Starting Value		
i or j :	1	2	3
n_j	3	1	1
b_i	4	5	6
c_i	1	1	1
1) a_i	0	0	0
		$J = 5$	

Before Transfer			
n_j	2	1	1
a_i	3	0	0

After Transfer			
c_i	3	1	1
b_i	4	5	6

Final Result			
	4	12	4
	5	18	7
	6	13	12
	11	8	12
	14	16	8
	12	21	12

4. THE 3-DIMENSIONAL

We shall show the details of raising or lowering

...ing quantities
 the minimal set) :
 the i th row and

column
 th row, and
 of its column
 ining the alternative
 put $a_i = 0$)
 columns being lowered
 ion of a step
 r the original array,
 e are then ready for

st j whose $n_j = 0$
 ns. At the k th

whose $a_i = 0$ and for
 at this minimum
 a_{ij} for $j = w_1, \dots, w_k$
 $= k+1$, jump to 2)

, put $n_j = 1$,
 i'
 thus: put $i_1 = \text{last } i'$,

to 7), if not
 ; put $t = t+1$, jump to 6)

ew) a_i ; jump to 1)
 d be 1), the $c_i =$
 e minimal set in the

mal set is much the
 maxima in their rows,
 not subtracted in
 details of the working
 ve programme, starting

with the array of (b) given earlier.

(l)

A Step of the Alternative Method (applied to (b))
Values of the Working Variables

Starting Values							During Lowering				
i or j :	1	2	3	4	5	6	k : 1 2 3				
n_j	3	1	1	1	0	0	2) {	w_k	5	3	4
b_i	4	5	6	8	10	12		M	4	0	2
c_i	1	1	1	2	3	4		i'	5	6	1
1) a_i	0	0	0	0	0	0		j'	5	5	3
$J = 5$							3) $a_{i'}$	5	5	3	
Before Transfer							4) {	$c_{i'}$	3	4	1
n_j	2	1	1	1	1	0	$n_{c_{i'}}$	1	1	3 > 1	
a_i	3	0	0	0	5	5	Transfer				
							t : 1 2				
After Transfer							i_t	1	5		
c_i	3	1	1	2	5	4	c_{i_t}	3	5 = J		
b_i	4	5	6	8	8	10					

(m)

Final Result of the above Step

4	12	4	23	16	20
5	18	7	16	19	27
6	13	12	19	23	28
11	8	12	19	19	24
14	16	8	20	8	25
12	21	12	10	10	15

4. THE 3-DIMENSIONAL ALLOCATION PROBLEM

We shall show by an example that the technique of raising or lowering columns, rows, etc., will not

succeed, in general, here.

The general element in an array here is a_{ijk} . The 2-dimensional array formed when $i = \text{constant}$ we shall call a row; when $j = \text{constant}$, a column; and when $k = \text{constant}$ a 'level'. Consider the following $2 \times 2 \times 2$ array:

	Level 1		Level 2	
Row 1	0	-4	1	1
Row 2	1	1	10	0
	Col 1	Col 2	Col 1	Col 2

The minimal set is 0, 0 as trial and error will show. We shall show that by adding r_1, r_2 to the rows and c_1, c_2 to the columns we cannot make the elements in the above 0,0, positions simultaneously zero. The modified array is:

$$\begin{array}{cccc} \underline{r_1+c_1} & -4+r_1+c_2 & r_1+c_1+1 & r_1+c_2+1 \\ r_2+c_1+1 & r_2+c_2+1 & r_2+c_1+10 & \underline{r_2+c_2} \end{array}$$

If the underlined elements are minima in their levels, then it follows that

$$\begin{array}{l} c_2 - c_1 - 4 > 0 \quad (1) \quad r_2 - r_1 + c_2 - c_1 + 1 > 0 \quad (2) \quad r_2 - r_1 + 1 > 0 \quad (3) \\ c_1 - c_2 + 10 > 0 \quad (4) \quad r_1 - r_2 + c_1 - c_2 + 1 > 0 \quad (5) \quad r_1 - r_2 + 1 > 0 \quad (6) \end{array}$$

From (1) and (5), $r_1 - r_2 > c_2 - c_1 - 1 > 4 - 1 = 3$
From (3) $1 > r_1 - r_2$
and the results are incompatible.

Similarly, adding to the rows and levels will not make the underlined elements minima in their columns, and adding to the levels and columns will not be successful either.

An intuitive way of seeing that such methods are unlikely to be successful is this: In the 2-dimensional array we have n^2 elements and (in effect) $2n$ quantities we can add, n to the columns and n to the rows. In the 3-dimensional case we have n^3 elements and only $3n$ quantities we can add. This is an order of magnitude too small.

5. THE 2ND, 3RD, ETC. BEST 2-DIMENSIONAL SOLUTION

However, it is possible to provide answers to these problems. We can find the 2nd best minimal solution this way: Take the minimal set, and replace each element of this set in turn by a large number

(say the sum of the set for each of the set is the 2nd best long as might be only slightly from possible for the element with the

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1

the best solution The 3rd best minimal set for the common element of (ii) making a non-common element of The smallest of the in an exceptional found. The situation can be found along

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 The modified array

$r_1 + c_2 + 1$
 $r_2 + c_2$
 na in their levels,

$$\begin{cases} r_1 - r_2 + 1 > 0 & (2) \\ r_2 - r_1 + 1 > 0 & (3) \\ r_1 - r_2 + 1 > 0 & (5) \\ r_1 - r_2 + 1 > 0 & (6) \end{cases}$$

$$4 - 1 = 3$$

ows and levels will
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ONAL SOLUTION

provide answers to
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 a large number

(say the sum of the row maxima). We find the minimal set for each of these modified arrays and their minimal set is the 2nd best solution. This will not take so long as might be thought, for the arrays will differ only slightly from the original array. However, it is possible for the second-best solution to have no common element with the best solution. In this array

0	1	100
100	0	1
1	100	0

the best solution is 0,0,0 and the 2nd best 1,1,1.

The 3rd best solution is found by finding the minimal set for the arrays formed by (i) making any common element of 1st and 2nd best solutions very large, (ii) making a non-common elemnt of the 1st and a non-common element of the 2nd simultaneously very large. The smallest of these solutions is the 3rd best. But, in an exceptional case nC_2 minimal sets might have to be found. The situation is worse for the 4th best which can be found along similar lines.

REFERENCES

- CHURCHMAN, C.W., ACKOFF, R.L., and ARNOFF, E.L., "Introduction to Operations Research" Chap 12, John Wiley, New York.
- EASTERFIELD, T.E., (1946) 'A Combinatorial Algorithm' J. London Math. Soc., 21, 219-226
 & (1961) 'An Algorithm for the Allocation Problem' Operat. Res. Quart., 11, No 3 (Sept)
- KUHN, H.W., (1955) 'The Hungarian Method for the Assignment Problem' Nav. Res. Log. Quart., 2, 83-98
- MAGOWAN, S., (1965) 'A Method of Plot to Track Correlation' Monograph 2153, Royal Radar Establishment, Malvern, England.