

Experimental analysis of an innovative approximate solution method for an integer programming problem

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ARTICLE INFO

Article history:
Received 05.09.2025
Received in revised form 17.09.2025
Accepted 25.09.2025
Available online 20.03.2026

Keywords:
Integer programming problem
Innovative approximate solution
Experimental analysis

ABSTRACT

The article presents an experimental analysis of an innovative approximate solution method for the integer programming problem, of which the author is a co-author. This method was published in a Web of Science-indexed journal. In that work, a theoretical investigation of the method was provided, and for clarity, the method was explained using a numerical example. However, no experiments were conducted there to determine the effectiveness of the method. Naturally, a more comprehensive conclusion regarding the effectiveness and quality of the method can be drawn after extensive experiments conducted on problems of various dimensions with random coefficients. Therefore, in this work, numerous problems of different dimensions and with random coefficients are solved by applying said method, and conclusions regarding the quality of the method are drawn.

1. Introduction

The article investigates an integer programming problem formulated as follows:

$$\sum_{j=1}^n c_j x_j \rightarrow \max \quad , \quad (1)$$

$$\sum_{j=1}^n a_{ij} x_j \leq b_i, \quad (i = \overline{1, m}) \quad , \quad (2)$$

$$0 \leq x_j \leq d_j \quad \text{and are integers,} \quad (j = \overline{1, n}). \quad (3)$$

Here, it is assumed that $c_j > 0$, $a_{ij} \geq 0$, $b_i > 0$ and $d_j > 0$, ($i = \overline{1, m}$, $j = \overline{1, n}$) are given numbers. Without loss of generality, we can assume these to be integers.

It should be noted that problem (1)-(3) is well-known in the literature, and methods such as “branch and bound” and other combinatorial-type methods have been developed to find its optimal solution [1-4], etc. However, it soon became clear that only problems with a small number of variables could be solved using these methods. This is because the maximum number of operations required by these methods is of exponential order, depending on the dimension of the problem. Such problems belong to the class of NP-complete, i.e., computationally difficult problems [5]. Therefore, various methods have been developed to find approximate (suboptimal) solutions for problem (1)-(3) and its

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www.icp.az/2026/1-08.pdf <https://doi.org/10.54381/icp.2026.1.08>
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special cases [6-14], etc.

It should be noted that most known approximate (suboptimal) solution methods are based on the principle of assigning a value to a single variable selected according to a specific criterion. As a result, the constructed solution may not coincide with the optimal solution. Therefore, it would be more accurate to call this solution a suboptimal solution rather than an approximate solution [7].

Numerous experiments conducted by various authors show that the discovered approximate (suboptimal) solutions in most cases differ significantly from the optimal solution. That is, the absolute and relative errors of the values these solutions provide to the objective function can be large compared to the optimal value. Therefore, it becomes necessary to develop new solution methods through which an initial approximate solution is found and subsequently improved as innovatively as possible. The problem of constructing an improved solution based on this idea was first addressed in [15]. Certain deficiencies in that method were pointed out in [16, 17], and new innovative solution methods were developed. In work [18], a method for constructing an initial solution and further improving it innovatively was provided for the more general class of integer programming problems. However, the quality of the method proposed in [18], in which the author of this article also participated, was not investigated through experimental analysis. As we see, it is necessary to draw a conclusion about the effectiveness of that method by conducting experiments on various large-dimension problems. To this end, the method was programmed, and extensive computational experiments were conducted.

2. Problem statement

Note that we will present some of the basic principles from [18] here without providing their proofs.

First, we assume that the indices of the variables in problem (1)–(3) correspond to the following principle:

$$\frac{c_1}{\max_i a_{i1}} \geq \frac{c_2}{\max_i a_{i2}} \geq \dots \geq \frac{c_k}{\max_i a_{ik}} \geq \dots \geq \frac{c_n}{\max_i a_{in}}$$

It should be noted that such numbering can always be achieved. Then, the coordinates of the initial solution

$$X^0 = (x_1^0, x_2^0, \dots, x_n^0) \tag{4}$$

are determined as follows.

$$x_j^0 = \min \left\{ d_j; \min_i \left[\left(b_i - \sum_{l=1}^{j-1} a_{il} x_l^0 \right) / a_{ij} \right] \right\}, \quad (j = \overline{1, n}). \tag{5}$$

In this case, the initial approximate value f^0 of function (1) is as follows:

$$f^0 = \sum_{j=1}^n c_j x_j^0$$

It should be noted that in the constructed initial solution $X^0 = (x_1^0, x_2^0, \dots, x_n^0)$, an index k is selected according to a specific rule to identify the coordinates that differ from the optimal solution, and by modifying the coordinates within a certain neighborhood of this index, new solutions are constructed. Here, the index k corresponds to the first coordinate in the solution $X^0 = (x_1^0, x_2^0, \dots, x_n^0)$ that is not equal to d_k .

In addition, it is not necessary to change the first $n(d)$ non-zero coordinates and the last $n(0)$ coordinates equal to zero in the solution X^0 . It should be noted that in work [18], certain theorems

were proven to find the numbers $\underline{n}(0)$ and $\underline{n}(d)$. The determination of these numbers is shown in the algorithm below.

Thus, the essence of the method proposed in [18] briefly consists in the following.

It is clear that in solution (4), the d_j numbers are located to the left of the k -th coordinate, while to the right, there are either numbers smaller than d_j or zeros.

Consequently, new solutions are constructed using formula (5) by iteratively assigning values $x_j = 1, 2, \dots, d_j$ for each fixed index $j=k+1, k+2, \dots, \underline{n}(0)$, and $x_j = d_{j-1}, d_{j-2}, \dots, 0$ for indices $j=\underline{n}(d), \underline{n}(d) + 1, \dots, k$. From this set of generated solutions, the one that maximizes the objective function (1) is selected and defined as the innovative approximate solution.

Let us write the algorithm for constructing this solution in a slightly modified form based on [18], as we will develop a program and conduct experiments using this specific algorithm.

Algorithm

Step 1. Input the numbers m, n and coefficients c_j, a_{ij}, b_i, d_j ($i = \overline{1, m}, j = \overline{1, n}$) and assign $bb_i := b_i; (i = \overline{1, m})$.

Step 2. For problem (1)-(3) determine the solution

$$\tilde{X} = (\tilde{x}_1, \tilde{x}_2, \dots, \tilde{x}_k, \dots, \tilde{x}_n) = (d_1, d_2, \dots, d_{k-1}, \frac{\alpha}{\beta}, 0, \dots, 0) \text{ as follows.}$$

For each index $j, (j = 1, 2, \dots, n)$

$$\tilde{x}_j = \begin{cases} d_j, & \text{if for } \forall i, (i = \overline{1, m}), a_{ij}d_j \leq b_i - \sum_{l=1}^{j-1} a_{il}\tilde{x}_l, \\ \min(b_i - \sum_{l=1}^{j-1} a_{il}\tilde{x}_l/a_{ij}), & \text{if } \exists i \text{ v, } a_{ij}d_j > b_i - \sum_{l=1}^{j-1} a_{il}\tilde{x}_l, (k := j), \\ 0, & j = k + 1, \dots, n \end{cases}$$

and set $kk:=k, r:=0$.

Step 3. If the obtained coordinate \tilde{x}_k is an integer, then the solution \tilde{X} coincides with the optimal solution $X^* = (x_1^*, x_2^*, \dots, x_n^*)$ of problem (1)-(3). In this case, set

$$f^* := \sum_{j=1}^n c_j \tilde{x}_j,$$

$X^* = (x_1^*, x_2^*, \dots, x_n^*) = (\tilde{x}_1, \tilde{x}_2, \dots, \tilde{x}_k, \dots, \tilde{x}_n)$ print these results and proceed to Step 21.

Step 4. Construct the initial approximate solution $X^0 = (x_1^0, x_2^0, \dots, x_n^0)$ for problem (1)-(3) as follows: for each index ($j = 1, 2, \dots, n$)

$$x_j^0 = \begin{cases} d_j, & \text{if for } \forall i, (i = \overline{1, m}), a_{ij}d_j \leq b_i - \sum_{l=1}^{j-1} a_{il}x_l^0, \\ \min_i \left[\left(b_i - \sum_{l=1}^{j-1} a_{il}x_l^0 \right) / a_{ij} \right], & \text{otherwise} \end{cases}$$

Step 5. Calculate \tilde{f} and f^0 as follows:

$$\tilde{f} = \sum_{j=1}^n c_j \tilde{x}_j, \quad f^0 = \sum_{j=1}^n c_j x_j^0,$$

Set $f^{it} := f^0$, and store f^{it} and $X^{it} = (x_1^0, x_2^0, \dots, x_n^0)$ as the innovative value and solution.

Step 6. To find the minimum number $\underline{n}(d)$ of non-zero coordinates, arrange the values $c_j, (j = \overline{1, n})$ as $c_1 \geq c_2 \geq \dots \geq c_n$, and use the following relationship:

$$\sum_{j=1}^{\underline{n}(d)} c_j d_j \leq f^0 \leq \sum_{j=1}^{\underline{n}(d)+1} c_j d_j$$

Step 7. For each index $i, (i = \overline{1, m})$ arrange the coefficients $a_{ij}, (i = \overline{1, m}, j = \overline{1, n})$ individually as $a_{i1} \leq a_{i2} \leq \dots \leq a_{in}$, and determine the numbers $n_i (i = \overline{1, m})$:

$$\sum_{j=1}^{n_i} a_{ij} d_j \leq b_i \leq \sum_{j=1}^{n_i+1} a_{ij} d_j, \quad (i = \overline{1, m}).$$

Finally, set $\bar{n} = \min_i n_i$ and $\underline{n}(0) = n - \bar{n}$.

Step 8. Set $x_k^t := [\tilde{x}_k]$; $b_i := b b_i - a_{ik} x_k^t, (i = \overline{1, m})$:

Step 9. For each index $j = 1, 2, \dots, n$ and $j \neq k$, using the formula

$$x_j^t = \begin{cases} d_j, & \text{if for } \forall i, (i = \overline{1, m}), \quad a_{ij} d_j \leq b_i - \sum_{l=1}^{j-1} a_{il} x_l^t, \\ \min_i \left[\left(b_i - \sum_{l=1}^{j-1} a_{il} x_l^t \right) / a_{ij} \right], & \text{otherwise} \end{cases}$$

determine the intermediate approximate solution $X^t = (x_1^t, x_2^t, \dots, x_n^t)$.

Step 10. Calculate f^t :

$$f^t := \sum_{j=1}^n c_j x_j^t$$

And if $f^t > f^{it}$, set $f^{it} := f^t, X^{it} = (x_1^t, x_2^t, \dots, x_n^t)$, and store these values.

Step 11. If $r = 0$, set $x_k^t := [x_k^t] + 1; b_i := b b_i - a_{ik} x_k^t, (i = \overline{1, m})$, then write $r := 1$ and proceed to Step 9.

Step 12. Assign $r := 0$.

Step 13. Determine the intermediate solution $X^t = (x_1^t, x_2^t, \dots, x_n^t)$ as follows:

For each fixed index $j, (j = 1, 2, \dots, n; j \neq k)$

$$x_j^t = \begin{cases} d_j, & \text{if for } \forall i, (i = \overline{1, m}), \quad a_{ij} d_j \leq b_i - \sum_{l=1}^{j-1} a_{il} x_l^t, \\ \min_i \left[\left(b_i - \sum_{l=1}^{j-1} a_{il} x_l^t \right) / a_{ij} \right], & \text{otherwise} . \end{cases}$$

Then, the current value of function (1.1) is

$$f^t := \sum_{j=1}^n c_j x_j^t$$

Step 14. If the condition $f^t > f^{it}$ is satisfied, then set $f^{it} := f^t, X^{it} = (x_1^t, x_2^t, \dots, x_n^t)$ and store these values. If $r = 1$, proceed to Step 18.

Step 15. If $x_k^t < d_k$, proceed to Step 17.

Step 16. Set $k := k + 1$. if the condition $k > n(0)$ is satisfied, then set $k := k k$, and proceed to Step 18.

Step 17. For the values $x_k^t := 1, 2, \dots, d_k$, set $b_i := b b_i - a_{ik} x_k^t, (i = \overline{1, m})$ accordingly and

proceed to Step 13.

Step 18. Set $r := 1$. If $x_k^t = d_k$, assign $k := k-1$. In this case, if the condition $k < n(d)$ is satisfied, proceed to Step 20.

Step 19. For the values $x_k^t := 1, 2, \dots, d_k$ set $b_i := bb_i - a_{ik}x_k^t (i = \overline{1, m})$, accordingly and proceed to Step 13.

Step 20. Print the obtained final innovative value f^{it} , the innovative approximate solution $X^{it} = (x_1^{it}, x_2^{it}, \dots, x_n^{it})$, and the relative errors $\delta = ([\tilde{f}] - f^t) / [\tilde{f}]$ and $\delta^i = ([\tilde{f}] - f^{it}) / [\tilde{f}]$.

Step 21. STOP.

3. Results of the computational experiment

In order to clarify the effectiveness of the innovative approximate solution method proposed in [18] for the integer programming problem, experiments were conducted on numerous problems of various dimensions. The coefficients of these problems were selected as two-digit or three-digit random integers. To conduct the experiments, a program developed based on the algorithm provided above was used. The coefficients for problem (1)-(3) are randomly chosen two-digit or three-digit numbers as follows:

$$0 < c_j < 100, \quad 0 < a_{ij} < 100, \quad (i = \overline{1, m}; j = \overline{1, n})$$

or

$$0 < c_j < 1000, \quad 0 < a_{ij} < 1000, \quad (i = \overline{1, m}; j = \overline{1, n}),$$

$$b_i = \left[\frac{1}{3} \sum_{j=1}^n a_{ij} \right], \quad (i = \overline{1, m}).$$

Here, the notation $[z]$ denotes the integer part of the number z .

It should be noted that during the experiments, 10 problems were solved for each $m \times n$ dimension. The results obtained are reflected in the tables below. Additionally, we have adopted the following notations in the tables:

N – the problem number.

f^b – the value of function (1) based on the initial solution.

f^i – the value of function (1) provided by the innovative solution.

P – the number of improvements made from the initial solution to the innovative solution.

$\Delta = f^i - f^b$ – the difference between the objective function values of the initial and innovative solutions.

$\delta = ((f^i - f^b) / f^i) \times 100$ – the relative percentage increase of the innovative value compared to the initial value.

Table 1
Problems with two-digit coefficients ($m \times n = 10 \times 100$)

| N | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
|----------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|
| f^b | 18821 | 19636 | 17781 | 17736 | 17940 | 16518 | 16562 | 18301 | 16521 | 18025 |
| f^i | 18990 | 19800 | 18034 | 17831 | 18202 | 16833 | 17157 | 18652 | 16837 | 18218 |
| P | 2 | 5 | 4 | 3 | 2 | 6 | 6 | 2 | 6 | 1 |
| Δ | 169 | 164 | 253 | 95 | 262 | 315 | 595 | 351 | 31 | 193 |
| δ | 0.889 | 0.828 | 1.402 | 0.533 | 1.439 | 1.871 | 3.468 | 1.882 | 0.184 | 1.059 |

Table 2
Problems with two-digit coefficients ($mxn = 10x200$)

| N | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
|----------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|
| f^b | 37553 | 35234 | 34660 | 36477 | 38814 | 34712 | 38225 | 37018 | 35470 | 36003 |
| f^i | 37832 | 35636 | 34660 | 36511 | 38866 | 34876 | 38854 | 37730 | 35588 | 36074 |
| P | 2 | 3 | 0 | 3 | 2 | 3 | 2 | 6 | 2 | 2 |
| Δ | 279 | 402 | 0 | 34 | 52 | 164 | 629 | 712 | 118 | 71 |
| δ | 0.737 | 1.128 | 0 | 0.093 | 0.134 | 0.003 | 1.619 | 1.887 | 0.331 | 0.003 |

Table 3
Problems with two-digit coefficients ($mxn = 10x300$)

| N | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
|----------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|
| f^b | 53318 | 54955 | 55311 | 51960 | 55450 | 54726 | 55935 | 56106 | 55898 | 54803 |
| f^i | 53532 | 55033 | 55492 | 52329 | 55746 | 55197 | 56278 | 56263 | 56034 | 55005 |
| P | 2 | 6 | 5 | 6 | 5 | 6 | 6 | 6 | 3 | 2 |
| Δ | 214 | 78 | 18 | 36 | 29 | 47 | 343 | 157 | 136 | 202 |
| δ | 0.399 | 0.142 | 0.032 | 0.068 | 0.052 | 0.085 | 0.609 | 0.279 | 0.243 | 0.367 |

Table 4
Problems with two-digit coefficients ($mxn = 10x500$)

| N | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
|----------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|
| f^b | 91631 | 92456 | 91048 | 92910 | 91524 | 89813 | 91903 | 92174 | 91639 | 93115 |
| f^i | 91983 | 93489 | 91561 | 93036 | 91524 | 90019 | 92074 | 92315 | 91788 | 93283 |
| P | 2 | 2 | 6 | 2 | 0 | 3 | 4 | 3 | 4 | 6 |
| Δ | 352 | 1033 | 513 | 126 | 0 | 206 | 171 | 141 | 149 | 168 |
| δ | 0.383 | 1.104 | 0.560 | 0.135 | 0 | 0.228 | 0.186 | 0.153 | 0.162 | 0.180 |

Table 5
Problems with two-digit coefficients ($mxn = 20x100$)

| N | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
|----------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|
| f^b | 16776 | 17041 | 17787 | 17466 | 17198 | 17568 | 16724 | 16958 | 17393 | 16890 |
| f^i | 16843 | 17100 | 18000 | 17629 | 17201 | 17662 | 16856 | 17099 | 17547 | 17212 |
| P | 2 | 1 | 2 | 2 | 1 | 1 | 3 | 6 | 2 | 1 |
| Δ | 67 | 59 | 213 | 163 | 3 | 94 | 132 | 141 | 154 | 322 |
| δ | 0.398 | 0.345 | 1.183 | 0.925 | 0.017 | 0.532 | 0.783 | 0.825 | 0.877 | 1.871 |

Table 6
Problems with two-digit coefficients ($mxn = 20x200$)

| N | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
|----------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|
| f^b | 36184 | 36080 | 34766 | 35481 | 36855 | 36568 | 36114 | 35118 | 34502 | 36108 |
| f^i | 36348 | 36331 | 34846 | 35654 | 37126 | 36597 | 36703 | 35149 | 34692 | 36329 |
| P | 4 | 5 | 2 | 5 | 5 | 2 | 7 | 1 | 3 | 5 |
| Δ | 164 | 251 | 80 | 173 | 271 | 29 | 589 | 31 | 190 | 221 |
| δ | 0.451 | 0.691 | 0.229 | 0.485 | 0.729 | 0.079 | 1.605 | 0.088 | 0.547 | 0.608 |

Table 7
Problems with two-digit coefficients ($mxn = 20x300$)

| N | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
|----------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|
| f^b | 55198 | 55269 | 53353 | 51764 | 54767 | 52516 | 53104 | 54175 | 51779 | 53263 |
| f^i | 55235 | 55450 | 53860 | 51789 | 54994 | 52646 | 53522 | 54358 | 51994 | 53715 |
| P | 2 | 4 | 5 | 2 | 5 | 3 | 4 | 3 | 5 | 5 |
| Δ | 37 | 181 | 507 | 25 | 227 | 130 | 418 | 183 | 215 | 452 |
| δ | 0.067 | 0.326 | 0.941 | 0.048 | 0.413 | 0.247 | 0.781 | 0.337 | 0.413 | 0.841 |

Table 8
Problems with two-digit coefficients ($m \times n = 20 \times 500$)

| N | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
|----------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|
| f^b | 91268 | 90388 | 89230 | 87994 | 91133 | 88792 | 92699 | 92124 | 91475 | 91045 |
| f^i | 91759 | 90563 | 89920 | 88217 | 91133 | 88910 | 92860 | 92532 | 92073 | 91317 |
| P | 5 | 5 | 7 | 3 | 0 | 5 | 6 | 6 | 4 | 3 |
| Δ | 491 | 175 | 690 | 223 | 0 | 118 | 161 | 408 | 598 | 272 |
| δ | 0.535 | 0.193 | 0.767 | 0.252 | 0 | 0.133 | 0.173 | 0.441 | 0.649 | 0.298 |

Table 9
Problems with three-digit coefficients ($m \times n = 10 \times 100$)

| N | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
|----------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|
| f^b | 189137 | 192567 | 176725 | 177541 | 183379 | 161529 | 168499 | 186562 | 162398 | 176601 |
| f^i | 190632 | 193258 | 177246 | 178615 | 185079 | 165653 | 172023 | 189668 | 162807 | 177923 |
| P | 2 | 3 | 2 | 3 | 4 | 4 | 3 | 2 | 5 | 4 |
| Δ | 1495 | 691 | 521 | 1074 | 1700 | 4124 | 3524 | 3106 | 409 | 1322 |
| δ | 0.784 | 0.357 | 0.294 | 0.601 | 0.918 | 2.489 | 2.048 | 1.637 | 0.251 | 0.743 |

Table 10
Problems with three-digit coefficients ($m \times n = 10 \times 200$)

| N | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
|----------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|
| f^b | 376043 | 356059 | 341499 | 359172 | 385246 | 342569 | 375415 | 379356 | 345283 | 353595 |
| f^i | 377044 | 357537 | 345237 | 361398 | 385324 | 346653 | 376140 | 382070 | 348344 | 355661 |
| P | 1 | 4 | 8 | 2 | 1 | 4 | 2 | 6 | 6 | 5 |
| Δ | 1001 | 1478 | 3738 | 2226 | 78 | 4084 | 725 | 2714 | 3061 | 2066 |
| δ | 0.265 | 0.413 | 1.083 | 0.616 | 0.020 | 1.178 | 0.193 | 0.710 | 0.879 | 0.580 |

Table 11
Problems with three-digit coefficients ($m \times n = 10 \times 300$)

| N | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
|----------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|
| f^b | 537690 | 557833 | 552637 | 518895 | 558147 | 539574 | 555582 | 549975 | 559675 | 535781 |
| f^i | 540738 | 558633 | 556197 | 520920 | 560628 | 546612 | 558584 | 552783 | 563947 | 537415 |
| P | 3 | 3 | 8 | 4 | 3 | 4 | 7 | 7 | 8 | 3 |
| Δ | 3048 | 800 | 3560 | 2025 | 2481 | 7038 | 3002 | 2808 | 4272 | 1634 |
| δ | 0.563 | 0.143 | 0.640 | 0.389 | 0.442 | 1.287 | 0.537 | 0.508 | 0.757 | 0.304 |

Table 12
Problems with three-digit coefficients ($m \times n = 10 \times 500$)

| N | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
|----------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|
| f^b | 918645 | 911207 | 897236 | 922863 | 945241 | 892176 | 914592 | 918346 | 903553 | 921537 |
| f^i | 919425 | 917334 | 899646 | 926286 | 946458 | 893869 | 15375 | 920185 | 905353 | 924319 |
| P | 2 | 7 | 2 | 2 | 7 | 6 | 2 | 3 | 2 | 3 |
| Δ | 780 | 6127 | 2410 | 3423 | 2481 | 1693 | 783 | 1839 | 1800 | 2782 |
| δ | 0.084 | 0.668 | 0.268 | 0.369 | 0.262 | 0.189 | 5.092 | 0.199 | 0.198 | 0.300 |

Table 13
Problems with three-digit coefficients ($m \times n = 20 \times 100$)

| N | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
|----------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|
| f^b | 167029 | 162927 | 179624 | 170039 | 161397 | 170899 | 166815 | 166324 | 174625 | 164408 |
| f^i | 168622 | 163848 | 180791 | 171696 | 162699 | 175227 | 169308 | 169104 | 176742 | 170243 |
| P | 2 | 1 | 2 | 4 | 1 | 3 | 5 | 2 | 1 | 3 |
| Δ | 1593 | 921 | 1167 | 1657 | 1302 | 4328 | 2493 | 2780 | 2117 | 5835 |
| δ | 0.944 | 0.562 | 0.645 | 0.965 | 0.800 | 2.465 | 1.472 | 1.643 | 1.98 | 3.427 |

Table 14

Problems with three-digit coefficients ($mxn = 20 \times 200$)

| N | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
|----------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|
| f^b | 349736 | 367889 | 344385 | 354111 | 373451 | 359763 | 362372 | 341298 | 335643 | 367658 |
| f^i | 353889 | 370869 | 345806 | 354556 | 375686 | 361853 | 368019 | 349088 | 341364 | 367658 |
| P | 7 | 3 | 4 | 3 | 3 | 4 | 8 | 5 | 5 | 0 |
| Δ | 4153 | 2980 | 1421 | 445 | 2235 | 2090 | 5647 | 7790 | 5721 | 0 |
| δ | 1.174 | 0.803 | 0.000 | 0.125 | 0.595 | 0.577 | 1.534 | 2.231 | 1.676 | 0 |

Table 15

Problems with three-digit coefficients ($mxn = 20 \times 300$)

| N | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
|----------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|
| f^b | 545303 | 546506 | 529668 | 507809 | 544962 | 521301 | 528902 | 530259 | 519653 | 529442 |
| f^i | 551774 | 552694 | 532980 | 509162 | 545433 | 526404 | 534831 | 531666 | 520031 | 533150 |
| P | 4 | 3 | 4 | 3 | 2 | 2 | 5 | 3 | 3 | 4 |
| Δ | 6471 | 6188 | 3312 | 1353 | 471 | 5103 | 5929 | 1407 | 378 | 3708 |
| δ | 1.172 | 1.119 | 0.621 | 0.265 | 0.086 | 0.969 | 1.108 | 0.264 | 0.072 | 0.695 |

Table 16

Problems with three-digit coefficients ($mxn = 20 \times 500$)

| N | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
|----------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|
| f^b | 904670 | 899223 | 905388 | 884686 | 894623 | 886330 | 915759 | 910015 | 905353 | 915136 |
| f^i | 907374 | 900954 | 908277 | 886116 | 898950 | 890008 | 924430 | 913142 | 908037 | 918957 |
| P | 11 | 5 | 6 | 5 | 4 | 5 | 5 | 5 | 5 | 6 |
| Δ | 2704 | 1731 | 2889 | 1430 | 4327 | 3678 | 8671 | 3127 | 2684 | 3821 |
| δ | 0.298 | 0.192 | 0.318 | 0.161 | 0.481 | 0.413 | 0.937 | 0.342 | 0.295 | 0.416 |

Based on the tables, the following final conclusions can be drawn.

4. Conclusion

– It is evident from the tables above that a total of 160 problems with both two-digit and three-digit random coefficients were solved. The initially found approximate solution was not improved in only four of these problems. It can be assumed that in those specific cases, the initial solution was already the optimal solution.

– The difference between the innovatively improved value and the initially determined value ranged from 0 to 4,084 units for problems with two-digit coefficients, and from 0 to 8,671 units for problems with three-digit coefficients.

– In the solution process, the number of consecutive improvements of the initial solution was at most 6 for problems with two-digit coefficients, and at most 8 for problems with three-digit coefficients. This means that in problems with larger coefficients, the initial solution differs significantly from the optimal solution. Consequently, in such cases, more frequent improvements occur.

– The maximum relative increase of the value provided by the innovative solution compared to the initial value was 5.092%, which is of significant importance for solving practical problems.

– Based on the tables above, we can conclude that the method proposed in [18] can provide significantly better solutions for real-world applied problems encountered in practice.

References

- [1] A.A. Korbut, Yu.Yu. Finkelshteyn, *Discrete Programming*, Moskva, Nauka, (1969) 368 p.
- [2] В.А. Емеличев, В.Н. Комлик, *Метод построения последовательности планов для решения задач дискретной оптимизации*, Москва, Наука, (1981) 208 p. [In Russian: V.A. Emelichev, V.N. Komlik, *Method of Constructing a Sequence of Plans for Solving Discrete Optimization Problems*, Moscow: Nauka]
- [3] И.Х. Сигал, А.П. Иванова, *Введение в прикладное дискретное программирование*, Москва, Физмат лит., (2007) p.304. [In Russian: I.Kh. Sigal, A.P. Ivanova, *Introduction to Applied Discrete Programming*, Moscow: Fizmatlit]
- [4] H. Kellerer, U. Pferschy, D. Pisinger, *Knapsack problems*, Springer-Verlag, Berlin, Heidelberg, New-York, (2004) 546 p.
- [5] M.R. Garey, *Computers and Intractability: a Guide to the Theory of NP-Completeness*, M.R. Garey, D.S. Johnson, San Francisco, Freeman, (1979) 314 p.
- [6] U.U. Finkelshteyn, *Priblijennye metody i prokladnie zadachi diskretnogo programmirovaniya*, Moskva, Nauka, (1976) 264 p.
- [7] J.A. Babayev, K. Sh. Mammadov, M.G. Mehdiyev, *Methods for constructing suboptimal solutions to the multidimensional knapsack problem*, *Computational Mathematics and Mathematical Physics*, Moscow. 28 No.6 (1978) pp.1443-1453.
- [8] М.М. Kovalev, *Discrete optimization (integer programming)*, Moscow, URCA, (2003) 191 p.
- [9] K. Sh. Mamedov, *Metodi postroeniya priblijennix resheniy mnoqomernoy zadachi o rance i naxojdenie verxney ocenki optimum*, K.Sh. Mamedov, T.M. Musaeva, *Avtomatika i Vychislitel'naya Texnika*. No.5 (2004) pp.72-82. [In Russian: K. Sh. Mamedov, *Methods for Constructing Approximate Solutions of the Multidimensional Knapsack Problem and Finding the Upper Bound of the Optimum*]
- [10] U.G. Nuriyev, *An algorithm for solving a multidimensional knapsack problem*, *Transactions of National Academy of Sciences of Azerbaijan, Series of physical-technical and mathematical sciences*. 21 No.2 (2001) pp.54-58.
- [11] I.V. Sergienko, V.P. Shilo, *Discrete optimization problems: Problems, methods, research*, Naukovo Dumka, 2003, 264 p.
- [12] И.В. Сергиенко, Л.Н. Козерацкая, Т.Т. Лебедева, *Исследование устойчивости и параметрический анализ дискретных оптимизационных задач*, Киев, Науково Думка, (1995) 170 p. [In Russian: I.V. Sergienko, L.N. Kozeratskaya, and T.T. Lebedeva, *Stability Research and Parametric Analysis of Discrete Optimization Problems*, Kyiv: Naukovo Dumka]
- [13] T. Erlebach, *Approximating multi-objective knapsack problems*, T. Erlebach, H. Kellerer, U. Pferschy, *Management Science*. No.48 (2002) pp.1603-1612.
- [14] V.V. Vazirani, *Approximation algorithms*, V.V. Vazirani, Berlin: Springer, (2001) 378 p.
- [15] К.Ш. Мамедов, С.Я. Гусейнов, *Методы построения субоптимальных решений задач целочисленного программирования и их последовательное улучшение*, *Автоматика и Вычислительная Техника*. No.6 (2007) pp.20-31. [In Russian: K.Sh. Mammadov and S.Ya. Huseynov, *Methods for constructing suboptimal solutions of integer programming problems and their sequential improvement*, *Avtomatika i Vychislitel'naya Tekhnika*]
- [16] K.Sh. Mammadov, R.R. Niyazova, S.Y. Huseynov, *Innovative approximate method for solving Knapsack problems with interval coefficients*, *International Independent Scientific Journal*. No.44 (2022) pp.8-12.
- [17] K.Sh. Mamedov, R.R. Niyazova, *Innovative improved approximate solution method for the integer Knapsack problem, Error compression and computational experiments*, *Radio Electronics, Computer Science, Control*. No.4 (2024) pp.64-74.
- [18] K.Sh. Mamedov, R.R. Niyazova, *An innovative approximate solution method for an integer programming problem*, *Radio Electronics, Computer Science, Control*. No.3 (2025) pp.195-205.
<https://doi.org/10.15588/1607-3274-2025-3-18>