

FAULT-TOLERANT METRIC DIMENSION PROBLEM: A NEW INTEGER LINEAR PROGRAMMING FORMULATION AND EXACT FORMULA FOR GRID GRAPHS

ANA SIMIĆ¹, MILENA BOGDANOVIĆ², ZORAN MAKSIMOVIĆ³,
AND JELISAVKA MILOŠEVIĆ⁴

ABSTRACT. In this paper, fault-tolerant metric dimension problem (FTMDP) is considered. The existing integer linear programming (ILP) formulation, from the literature is improved, using lesser number of variables and constraints. Correctness proof shows that improved linear programming formulation is equivalent to the existing one. Computational results on random graphs proposed for similar problems in the literature, clearly show the advantage of a new ILP formulation. Additionally, the exact value of fault-tolerant metric dimension of grid graphs are given and proved.

1. INTRODUCTION

The metric dimension problem was introduced independently by Slater (1975) [10] and Harary and Melter (1976) [4]. Shortly, the metric dimension of an undirected and connected graph G is the minimum cardinality of a subset S of vertex set V of G with the property that all the vertices in V are uniquely determined by their distances to the vertices in S .

One of most interesting application of the metric dimension problem arises in robot navigation [8]. Let a robot is navigating in a space modeled by a graph G and it wants to know its current position. Robot usually send a signal to find out how far it is from each among a set of fixed vertices which we call landmarks. The problem of determining the minimum number of landmarks and their positions such that the robot can always uniquely determine its location is equivalent to the metric dimension problem.

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If one of landmarks does not work properly, we will not have enough information for a robot to uniquely determine its location. In order to overcome this kind of problems, concept of fault-tolerant metric dimension was introduced by Hernando et al. (2008) [5]. Fault-tolerant resolving set provide correct information even when one of the landmarks is not working. Shortly, a resolving set is said to be fault-tolerant if the removal of any element from it keeps it resolving. The fault-tolerant metric dimension (FTMD) of G is the minimum cardinality of a fault-tolerant resolving set, denoted by $\beta'(G)$.

2. PREVIOUS WORK

Javaid et al. (2009) [7] were presented that for every pair $a, b \in \mathbb{N}$, $a \neq b - 1$ and $5 \leq a \leq b$, is realizable as the fault-tolerant metric dimension and the fault-tolerant partition dimension of some connected graphs. Also, bounds of maximum order of a graph G was presented in terms of its diameter, fault-tolerant metric dimension and the fault-tolerant partition dimension.

In [2] was shown that for every pair $a, b \in \mathbb{N}$ with $b \geq 6$ and $\lfloor \frac{b}{2} \rfloor + 1 \leq a \leq b - 2$ is realizable as the fault-tolerant metric dimension and the fault-tolerant partition dimension of some connected graphs. Also, it was given the classification when a fault-tolerant partition dimension of graph is equal to its order, i.e., $\beta'(G) = |G|$.

In [6] were shown that every pair $a, b \in \mathbb{N}$ with $a \leq b$, $2 \cdot a \neq b + 3$, and $2 \cdot a \geq b + 2$ is realizable as the fault-tolerant metric dimension and the fault-tolerant partition dimension of some connected graphs. Moreover, in [6] some theoretical properties of weak total metric dimension and strong total metric dimension of G were presented.

Azhar (2015) [1] was found the fault-tolerant metric dimension of 4-regular family of Harary graphs $H(4, n)$, for all $n \geq 8$. He was proved that this was a family of graphs with constant fault-tolerant metric dimension, i.e., independent of the choice of graphs in the family. Moreover, the metric dimension, the total metric dimension and the weak total metric dimension of those graphs were found.

3. EXISTING MATHEMATICAL FORMULATIONS

3.1. Basic mathematical formulation. Let a simple connected undirected graph $G = (V, E)$, where $V = \{1, 2, \dots, n\}$ and $|E| = m$. It is easy to determine the length $d(u, v)$ of a shortest $u - v$ path for all $u, v \in V$ using any shortest path algorithm. A vertex p of the graph G is said to resolve (distinguish) two vertices u and v of G if $d(u, p) \neq d(v, p)$. An ordered vertex set $S = \{s_1, s_2, \dots, s_k\}$ of G is a fault-tolerant resolving set of G , if for each vertex $p \in S$, every two distinct vertices $u, v \in V$ of G are resolved by some vertex of $S \setminus \{p\}$. A fault-tolerant metric basis of G is a fault-tolerant resolving set of the minimum cardinality. The fault-tolerant metric dimension of G , denoted by $\beta'(G)$, is the cardinality of its fault-tolerant metric basis.

3.2. Existing ILP formulation. In this subsection it will be presented existing integer linear programming formulation from [9]. The coefficient matrix A is defined as follows:

$$(3.1) \quad A_{(u,v),(i,j)} = \begin{cases} 1, & d(u,i) \neq d(v,i) \text{ and } d(u,j) \neq d(v,j), \\ 0, & d(u,i) = d(v,i) \text{ or } d(u,j) = d(v,j), \end{cases}$$

where $1 \leq u < v \leq n$, $1 \leq i < j \leq n$. Variable x_i described by (3.2) determines whether vertex i belongs to a set S . Similarly, variable y_{ij} described by (3.3) determines whether both i, j are in S , that is

$$(3.2) \quad x_i = \begin{cases} 1, & i \in S, \\ 0, & i \notin S, \end{cases}$$

$$(3.3) \quad y_{ij} = \begin{cases} 1, & i, j \in S, \\ 0, & \text{otherwise.} \end{cases}$$

The ILP model of the FTMD problem from [9] can now be formulated as:

$$(3.4) \quad \min \sum_{i=1}^n x_i$$

subject to:

$$(3.5) \quad \sum_{i=1}^{n-1} \sum_{j=i+1}^n A_{(u,v),(i,j)} \cdot y_{ij} \geq 1, \quad 1 \leq u < v \leq n,$$

$$(3.6) \quad y_{ij} \leq \frac{1}{2}x_i + \frac{1}{2}x_j, \quad 1 \leq i < j \leq n,$$

$$(3.7) \quad y_{ij} \geq x_i + x_j - 1, \quad 1 \leq i < j \leq n,$$

$$(3.8) \quad y_{ij} \in \{0, 1\}, \quad x_k \in \{0, 1\}, \quad 1 \leq i < j \leq n, 1 \leq k \leq n.$$

The objective function (3.4) represents the minimal cardinality of a set S . Constraints (3.5)-(3.7) make sure that for each two vertices u and v there exists at least two vertices from set S which resolves u and v , i.e., S is a fault-tolerant resolving set. Constraints (3.8) reflect the binary nature of decision variables x_i and y_{ij} .

4. A NEW INTEGER LINEAR PROGRAMING FORMULATION

In order to give a new improved ILP model we must change matrix $A_{(u,v),(i,j)}$ defined by (3.1) into the new matrix $A'_{(u,v),i}$:

$$(4.1) \quad A'_{(u,v),i} = \begin{cases} 1, & d(u,i) \neq d(v,i), \\ 0, & d(u,i) = d(v,i). \end{cases}$$

Now, constraints (3.5)-(3.8) is replaced by new ones

$$(4.2) \quad \sum_{i=1}^n A'_{(u,v),i} \cdot x_i \geq 2, \quad 1 \leq u < v \leq n,$$

$$(4.3) \quad x_k \in \{0, 1\}, \quad 1 \leq k \leq n.$$

Therefore, a new ILP formulation of FTMDP contains objective function (3.4) subject to (4.2) and (4.3). The equivalence of a new ILP formulation with original mathematical formulation of the FTMDP is given in following proposition.

Proposition 1. Set S is a fault-tolerant resolving set of G of minimal cardinality if and only if constraints (3.4), (4.2) and (4.3) are satisfied.

Proof. (\Rightarrow) Suppose that S is a fault-tolerant resolving set, then S is also a resolving set. Let we define x_i as in (3.2). Then, constraints (4.3) are satisfied by default. Let we fix u and v such that $1 \leq u < v \leq n$. Since S is a resolving set then there exist $p \in S$ such that $d(u, p) \neq d(v, p)$. Additionally, S is a fault-tolerant resolving set, so for vertex $p \in S$ it holds $(\exists q \in S \setminus \{p\}) d(u, q) \neq d(v, q)$. Therefore, it holds $A'_{(u,v),p} = A'_{(u,v),q} = 1$ and $x_p = x_q = 1$, so $\sum_{i=1}^n A'_{(u,v),i} \cdot x_i \geq 2$, which means that constraints (4.2) are satisfied. Since $\sum_{i=1}^n x_i = |S|$, it holds that minimal objective function of ILP model (3.4), (4.2), (4.3) is less or equal than $|S|$.

(\Leftarrow) Let we define set $S = \{i \mid x_i = 1\}$. By constraints (4.2) and binary nature of variables x_i which are ensured by constraints (4.3), it holds that for each $1 \leq u < v \leq n$ there exist at least two vertices i_1 and i_2 for which it is $A'_{(u,v),i_1} = A'_{(u,v),i_2} = 1$ and $x_{i_1} = x_{i_2} = 1$, or equivalently $d(u, i_1) \neq d(v, i_1)$, $d(u, i_2) \neq d(v, i_2)$, $i_1 \in S$ and $i_2 \in S$. Therefore, it is obvious that if we exclude arbitrary member from set S , at least one member of remainder of S resolve pair u and v . Therefore, S is a fault-tolerant resolving set, with cardinality equal to $\sum_{i=1}^n x_i$, so it follows that fault-tolerant resolving set with minimal cardinality has at most $\sum_{i=1}^n x_i$ elements. \square

Note that, the new ILP model (3.4), (4.2) and (4.3) has only n binary variables and $\binom{n}{2}$ constraints which is much smaller compared to ILP model (3.4)-(3.8) from [9], which has $\binom{n}{2} + n$ binary variables and $3 \cdot \binom{n}{2}$ constraints.

5. GRID GRAPHS

For this class of graphs $GR(a, b)$, vertices can be represented as $V = \{(i, j) \mid 1 \leq i \leq a, 1 \leq j \leq b\}$ and each vertex $v = (i, j)$ has at least two and at most four neighbours: $(i - 1, j)$ for $i > 1$, $(i + 1, j)$ for $i < a$, $(i, j - 1)$ for $j > 1$ and $(i, j + 1)$ for $j < b$.

In the sequel there will be used one trivial property of grid graphs.

Property 1. For grid graph and every two vertices $u, v \in V$, and vertex w such that $d(v, w) = 1$ it holds $d(u, w) = d(u, v) + 1$ or $d(u, w) = d(u, v) - 1$.

Now, we will give the exact value of fault-tolerant metric dimension on grid graphs.

Theorem 5.1. For $a, b \in \mathbb{N}$, $a \leq b$, holds

$$\beta'(GR(a, b)) = \begin{cases} \text{undefined,} & a = b = 1, \\ 2, & a = 1, b \geq 2, \\ 4, & a \geq 2. \end{cases}$$

Proof. $a = b = 1$. Graph $GR(1, 1)$ is trivial graph with one vertex without edges, so it obviously have no fault-tolerant resolving set which must have at least two elements. Therefore $\beta'(GR(1, 1))$ is undefined.

$a = 1, b \geq 2$. Obviously $GR(1, b) \cong P_b$, where P_b is a path with b vertices. Easily, set $S = \{1, b\}$ is fault-tolerant resolving set, since

$$i \neq j \Rightarrow (d(i, 1) = i - 1 \neq j - 1 = d(j, 1) \wedge d(i, b) = b - i \neq b - j = d(j, b)).$$

Since fault-tolerant metric dimension is at least 2, it holds $\beta'(GR(1, b)) = \beta'(P_b) = 2$.

$a \leq b, a \geq 2$, Upper bound. We prove that set $S = \{(1, 1), (1, b), (a, 1), (a, b)\}$ is a fault-tolerant resolving set. Let $u = (i_u, j_u)$ and $v = (i_v, j_v)$ are two different arbitrary vertices from $GR(a, b)$.

- Case 1: $i_u + j_u \neq i_v + j_v$. In this case, $d(u, (1, 1)) = i_u + j_u - 2 \neq i_v + j_v - 2 = d(v, (1, 1))$ and $d(u, (a, b)) = a + b - i_u - j_u \neq a + b - i_v - j_v = d(v, (a, b))$.
- Case 2: $i_u - j_u \neq i_v - j_v$. In this case, $d(u, (1, b)) = b - 1 + i_u - j_u \neq b - 1 + i_v - j_v = d(v, (1, b))$ and $d(u, (a, 1)) = a - 1 - i_u + j_u \neq a - 1 - i_v + j_v = d(v, (a, 1))$.
- Case 3: $i_u + j_u = i_v + j_v$ and $i_u - j_u = i_v - j_v$. Easily, by summation and subtraction, we have $i_u = i_v$ and $j_u = j_v$, which is in contradiction with premise that u and v are different.

From Case 1 and Case 2, it is evident that set S is a fault-tolerant resolving set of $GR(a, b)$.

$a \leq b, a \geq 2$, Lower bound. Now, we must prove that fault-tolerant resolving set of grid graph in this case have cardinality at least 4. Suppose the contrary, that exists fault-tolerant resolving set of cardinality equal to 2 or 3, and prove the contradiction. Let in case of $|S| = 2$ denote $S = \{p, q\}$, while for $|S| = 3$ denote $S = \{p, q, r\}$ with $p = (i_p, j_p)$, $q = (i_q, j_q)$ and $r = (i_r, j_r)$.

We have the following cases.

- Case 1: $|S| = 2$. Since all vertices in grid graph have at least two neighbours, let $u, v \in V$, $u \neq v$, be the neighbours of p . Therefore, $d(u, p) = d(v, p)$ so $S = \{p, q\}$ is not fault-tolerant resolving set, since if we omit vertex q , it not distinguish all vertices from V .
- Case 2: $|S| = 3$ and at least one i_p, i_q, i_r is diferent from 1 and diferent from a , or at least one j_p, j_q, j_r is diferent from 1 and diferent from b . Without loss of generality we can presume $i_p \neq 1 \wedge i_p \neq a$. In that case vertex p has 3 or

4 neighbours. By Property 1, there are two neighbours of p named u and v , such that $d(u, q) = d(v, q) = d(p, q) + 1$ or $d(u, q) = d(v, q) = d(p, q) - 1$. Since, there exist two vertices u and v such that $d(u, p) = d(v, p)$ and $d(u, q) = d(v, q)$, then S is obviously not a fault-tolerant resolving set.

- Case 3: $|S| = 3$ and all i_p, i_q, i_r is equal to 1 or equal to a , and all j_p, j_q, j_r is equal to 1 or equal to b . Without loss of generality we can presume $r = (1, 1)$, $q = (1, b)$ and $p = (a, 1)$. Let $u = (a - 1, 1)$ and $v = (a, 2)$. Then $d(u, p) = d(v, p) = 1$ and $d(u, q) = d(v, q) = d(p, q) - 1$. Once again, there exist two vertices u and v such that $d(u, p) = d(v, p)$ and $d(u, q) = d(v, q)$, then S is obviously not a fault-tolerant resolving set.

In all three cases we have contradiction with starting premise $|S| \leq 3$. Since it is already proved that for $a \geq 1$ it holds $\beta'(GR(a, b)) \leq 4$, then for $a \geq 1$ fault-tolerant metric dimension of $GR(a, b)$ is equal to 4. \square

6. COMPUTATIONAL RESULTS

In this section computational results and direct comparison between new and existing ILP formulation will be presented. All computations were executed on AMD FX-8300, 3.3 GHz PC with 4GB RAM using single core. The both ILP models were coded in CPLEX 12.6 solver using the C programming language.

Random instances from [3], with 50 and 100 vertices, were used for testing. This set of instances contains overall 36 graphs, from sparse to dense ones. The time limit for CPLEX solver on each model is set to two hours (7200 seconds). If CPLEX does not finish work and prove optimality in that time interval, running is stopped and partial results of solution value and lower bound is reported.

Table 1 contains experimental data for instances whose optimal solution is proven by CPLEX solver with at least one model. In the first column the name of an instance is given, while second and third columns represent the number of vertices and the number of edges. The fourth column is labeled with *Opt* and contains corresponding optimal solution value. Next three columns represent the data obtained by CPLEX on existing model from [9]:

- the fifth column is labeled as *Sol* and contains the obtained result, with notation *opt* if the optimal solution is proved or value with asteriks if it is only reached;
- the sixth column labeled by *LB* contains the lower bound if the optimal solution is not proved, while otherwise it is blank;
- next column, labeled by *t* presents total running time in seconds.

Last three columns represent the data obtained by CPLEX on the new model, presenting in the same way as for existing ILP model.

Note that we present original lower bounds given by CPLEX solver. Since the objective function value is integer, each non-integer lower bound can be replaced by first integer greater or equal than it.

TABLE 1. Results on instances with known optimal solution

<i>Inst.</i>	V	E	<i>Opt</i>	<i>ILP from [9]</i>			<i>New ILP</i>		
				<i>Sol</i>	<i>LB</i>	<i>t [sec]</i>	<i>Sol</i>	<i>LB</i>	<i>t [sec]</i>
Random-50-1	50	49	11	opt		0.625	opt	0.015	
Random-50-2	50	49	6	opt		0.937	opt	0.031	
Random-50-3	50	58	18	opt		0.796	opt	0.015	
Random-50-4	50	54	12	opt		0.640	opt	0.015	
Random-50-5	50	67	9	opt		1.609	opt	0.031	
Random-50-6	50	86	7	opt		1007	opt	0.093	
Random-50-7	50	84	6	6*	2.3019	7200	opt	0.921	
Random-50-8	50	95	6	6*	2.3805	5623	opt	1.171	
Random-50-9	50	108	6	7	2.2462	7200	opt	2.218	
Random-50-10	50	112	7	7*	2.2978	6230	opt	2.25	
Random-50-20	50	248	10	11	2.4616	7200	opt	104.2	
Random-50-30	50	373	10	11	2.7286	7200	opt	62.75	
Random-50-40	50	475	10	11	2.1928	7200	opt	291.1	
Random-50-50	50	597	9	10		2 7200	opt	90.29	
Random-50-60	50	739	10	10*		2 7200	opt	300.0	
Random-50-70	50	860	10	12	2.1917	7200	opt	23.58	
Random-50-80	50	980	13	13*	4.247	7200	opt	29.75	
Random-50-90	50	1103	18	20	11.1306	5103	opt	0.656	
Random-100-1	100	100	11	opt		9.656	opt	0.156	
Random-100-2	100	109	18	opt		9.218	opt	0.171	
Random-100-3	100	181	8	9	2.2179	7200	opt	2.296	
Random-100-4	100	206	7	100	0.1598	3057	opt	50.76	
Random-100-5	100	231	8	100	0.2244	3316	opt	1627	

As it can be seen from Table 1, CPLEX based on existing ILP model from [9] was able, within two hour time limit, to prove optimality of 6 out of 18 instances with 50 vertices, and 2 out of 18 instances with 100 vertices. It additionally reach optimal solutions in 5 cases for instances with 50 vertices. On the other hand, CPLEX based on new ILP model was able within two hour time limit, to prove optimality of all 18 instances with 50 vertices, and 5 out of 18 instances with 100 vertices.

Running times of CPLEX based on existing ILP model is in all cases significantly larger than running times of CPLEX based on new ILP model. For example, for *Random-50-6* instance, CPLEX based on existing ILP model prove optimality in 1007 seconds while CPLEX based on new ILP model for that needs only 0.093 seconds.

Table 2 contain the experimental data for the instances with unknown optimal solution. The meaning of all columns is the same as in Table 1, except that column *Opt* is omitted, since optimal solution is not known.

As it can be seen from Table 2, CPLEX based on new ILP model again produce much better results than CPLEX based on existing ILP model, both in quality of

TABLE 2. Results on instances with unknown optimal solution

<i>Inst.</i>	V	E	<i>ILP from [9]</i>			<i>New ILP</i>		
			<i>Sol</i>	<i>LB</i>	<i>t [sec]</i>	<i>Sol</i>	<i>LB</i>	<i>t [sec]</i>
Random-100-6	100	321	11	0.1693	7200	9	6.4878	3192
Random-100-7	100	317	11	0.1843	7200	9	6.6993	2765
Random-100-8	100	398	12	0.1790	7200	10	6.4962	1984
Random-100-9	100	430	11	0.1455	7200	10	6.3796	1575
Random-100-10	100	498	12	0.1697	7200	11	6.8225	4862
Random-100-20	100	981	19	0.4291	7200	16	9.6572	2710
Random-100-30	100	1477	16	0.2517	7200	13	8.5100	7200
Random-100-40	100	1945	14	0.1782	7200	12	7.1708	2593
Random-100-50	100	2483	13	0.1610	7200	12	7.0782	7200
Random-100-60	100	2985	14	0.1803	7200	12	7.4088	7200
Random-100-70	100	3435	15	0.2547	7200	13	8.3824	5733
Random-100-80	100	3935	20	0.7110	7200	17	10.5280	1547
Random-100-90	100	4446	32	1.9505	7200	24	18.5498	1591

obtained result and quality of obtained lower bound. For example, for *Random-100-90* instance, CPLEX based on new ILP model obtain solution of value 24 with lower bound $\lceil 18.5498 \rceil = 19$, while CPLEX based on existing ILP model obtain solution of value only 32 with much worse lower bound equal to $\lceil 1.9505 \rceil = 2$.

7. CONCLUSIONS

This paper is devoted to the fault-tolerant metric dimension problem. Exact results of fault-tolerant metric dimension on grid graphs are given and proved. Proposing the new integer linear programming formulation with much less variables and constraints comparing to the formulation from literature, provide a significant memory savings for solving current problem. Formal proof that a new model is equivalent to the existing one, is also presented. From computational results it is evident, not only theoretical advantage of a new model, but also practical improvements of the computational efforts for solving present problem.

Future work can be directed to designing an exact method using proposed ILP formulation. Other direction of future work can be solving some other similar graph problems.

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¹FACULTY OF MATHEMATICS,
UNIVERSITY OF BELGRADE,
STUDENTSKI TRG 16, 11000 BELGRADE, SERBIA
Email address: simicana4as@gmail.com

²PEDAGOGICAL FACULTY,
UNIVERSITY OF NIŠ,
PARTIZANSKA 14, 17500 VRANJE, SERBIA
Email address: mb2001969@beotel.net

³MILITARY ACADEMY,
UNIVERSITY OF DEFENCE,
GENERALA PAVLA JURIŠIĆA ŠTURMA 33, 11000 BELGRADE, SERBIA
Email address: zoran.maksimovic@gmail.com

⁴FASPER,
UNIVERSITY OF BELGRADE,
VISOKOG STEVANA 2, 11000 BELGRADE, SERBIA
Email address: jelisavkam@gmail.com