

# CAHIER DU LAMSADE

Laboratoire d'Analyse et Modélisation de Systèmes pour l'Aide à la Décision  
(Université Paris-Dauphine)  
Unité de Recherche Associée au CNRS ESA 7024

## ON-LINE VERTEX-COVERING

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# Recouvrement *on-line* d'un graphe

## Résumé

En algorithmique *on-line*, l'instance d'un problème est révélée en différentes étapes. A l'issue de chacune d'elles on doit prendre des décisions irrévocables sur la partie qui vient d'être révélée (qu'elle est la contribution de cette partie à la solution que l'on construit?). Nous commençons par étudier le problème de couverture de sommets sous deux modèles *on-line* qui correspondent à deux manières différentes de révéler les sommets. Le premier impose que le graphe instance est révélé sommet par sommet. Dans le second modèle le graphe est révélé par paquets, chaque paquet étant un sous-graphe induit de l'instance complète. Puis, dans le modèle par paquets, nous relaxons la contrainte que le choix des sommets du paquet à inclure dans la solution est irrévocable. Plus précisément nous autorisons un *backtracking* : une décision sur un sommet peut être modifiée modulo un coût qui dépend du nombre global de sommets modifiés. Enfin nous étudions un modèle simple où les instances sont révélées arête par arête.

**Mots-clé** : algorithme *on-line*, recouvrement d'un graph, rapport de compétitivité, rapport d' approximation.

## On-line vertex-covering

### Abstract

In *on-line* computation, the instance of a problem is revealed step-by-step and one has, at the end of each step, to irrevocably decide on the part of the final solution dealing with this step. We first study the minimum vertex-covering problem under two *on-line* models corresponding to two different ways vertices are revealed. The former one implies that the input-graph is revealed vertex-by-vertex. The second model implies that the input-graph is revealed per clusters, i.e., per induced subgraphs of the final graph. Under the cluster-model, we then relax the constraint that the choice of the part of the final solution dealing with each cluster has to be irrevocable, by allowing backtracking. We assume that one can change decisions upon a vertex membership of the final solution, this change implying, however, some cost depending on the number of the vertices changed. Finally we study simple model where instance is revealed edge-by-edge.

**Keywords**: *on-line* algorithm, vertex-covering, competitiveness ratio, approximation ratio.

## 1 Introduction

On-line computation is very natural in operational research since there exist situations modeled as problems for which the final data-set is not a priori known. In other words, data are revealed step-by-step. Frequently, when one tries to solve such problems many types of constraints (for example, deadlines on the final solution delivery, deadlines on the implementation of the solution computed) force her/him to start problem's solution before the whole set of data is completely revealed. On the other hand, these constraints may be strict enough forcing so the problem solver to irrevocably decide on the part of the final solution dealing with each part of data revealed, or may be relatively weak, allowing her/him to go back over decisions previously taken about the partial solution computed at each step.

Let  $\Pi$  be an **NP** optimization graph-problem. The *on-line* version of  $\Pi$ , denoted by  $L\Pi$ , is the pair  $(\Pi, \mathbf{R})$  where  $\mathbf{R}$  is a set of rules dealing with:

1. information on the value of some parameters of the final graph,
2. how the final graph is revealed.

An *on-line* algorithm  $A$  decides at each step which of the data (vertices or edges) revealed during this step will belong to the final solution. Its performance is measured in terms of the so-called competitiveness ratio  $c_A$  defined, for an instance  $G$  and a set  $\mathbf{R}$ , as the ratio of the worst<sup>1</sup> value of the solution computed by it when running on  $G$  to the value of a solution computed off-line, i.e., by an algorithm running once the final graph is completely known. In this paper we deal with deterministic on-line algorithms. The above measure of the quality of an on-line algorithm has been originally introduced in [12], in order to study a fundamental computer science problem, the paging problem. Interesting reviews on on-line algorithms (under competitive analysis) are presented in [9, 6]. Also, an interested financial application of on-line computing is solved in [5]. On-line graph problems studied until now are, to our knowledge, the traveling salesman ([1]), the graph-coloring ([7, 10, 8]) and the independent set ([4]).

Let us consider a company receiving manufacturing orders from its clients. These orders have to be accepted or rejected as soon as they arrive. Acceptance or rejection of the orders can be provided either immediately, i.e., as soon as any order arrives (*alternative 1*), or at the end, say of each month (*alternative 2.1*), or after a fixed number of orders (say 100 orders) has arrived (*alternative 2.2*). Incompatibilities between orders (due to the fabrication time, the materials required, etc.) are pairwise incompatibilities; so a set of globally compatible orders is an independent set in the order-incompatibility graph (where orders are its vertices). If the objective of the company is to maximize the number of the compatible orders accepted during, say one year's period (or the global profit implied by them), then the problem to be solved is the *on-line maximum independent set problem*. However, assume a public company or even a company operating with privileged clients. In both situations, the company is constrained to accept any order emanating from its clients and has either to manufacture orders by itself, or to use sub-contractors. Then, its objective is not to maximize the profit, but to minimize the subcontracting cost during, for example, one year's period. So, with respect to the incompatibility graph mentioned just above, one has to minimize the complement of a maximum independent set, i.e., a vertex-cover, and the problem to solve is the *on-line minimum vertex-covering*. This is the problem we deal with in this paper.

Minimum vertex-covering problem, denoted by VC in the sequel, is defined as follows: *given a graph  $G(V, E)$ , compute the minimum-cardinality set  $V' \subseteq V$  such that,  $\forall v_i v_j \in E$ , at least one of the  $v_i, v_j$  belongs to  $V'$* . We consider that  $G$  (we set  $n = |V|$  and suppose  $n$  known

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<sup>1</sup>Over all the ways  $G$  is revealed according to  $\mathbf{R}$ .

at the beginning of the game) is revealed per non-empty clusters, i.e., per induced subgraphs  $G_1(V_1, E_1), G_2(V_2, E_2), \dots$  of  $G$  (we denote by  $n_i$  the order of  $G_i, i = 1, 2, \dots$ ). Every time a new cluster  $G_i$  is revealed, the edges linking the vertices of  $G_i$  with the vertices of  $G_j, j < i$  are also revealed. We denote by  $t$  the number of clusters needed so that the whole graph is completely revealed.

We first focus ourselves on the case where graph is revealed by means of its vertices and consider  $t = n$ , i.e., that  $G$  is revealed vertex-by-vertex. This is what we have called *alternative 1* in our company model described previously. We establish a general result about the performance of every minimal VC-algorithm (i.e., an algorithm computing a minimal vertex-cover) in comparison with the maximum matching algorithm for VC, informally, the ratio of any minimal vertex-cover against the vertex-cover computed by the maximum matching algorithm is bounded above by  $\Delta/2$ . Using this result, we establish the competitiveness ratio of a very simple but very natural on-line algorithm entering a newly presented vertex  $v$  in the covering  $C$  under construction, if there exists an edge incident to  $v$  (hence revealed together with  $v$ ) the already revealed endpoint  $u$  of which does not belong to  $C$  (following our assumption about the way  $G$  is revealed,  $u$  has arrived before  $v$ ).

Next, we generalize our study assuming  $t < n$  and study the competitiveness ratio of (more complicated) on-line algorithms for LVC against an optimal off-line algorithm. Here we distinguish two cases:  $2 < t < n$  and  $t = 2$ . With respect to our company model, the former represents *alternative 2.1*; *alternative 2.2*, not studied here, could represent a situation where all the clusters are of the same order. Then, we analyze the case  $t = 2$ . This case has, as we shall see, its own mathematical interest. Furthermore, even in the framework of our company model it is very natural. Revisit this model and suppose that in order that the products start to be manufactured, say at the instant  $t + 15$ , orders have to be arrived at instant  $t$ . But for some reasons (e.g., organizational or promotional ones), clients have been granted some extra delay, for example  $t + 10$ , in order to send orders to be manufactured at  $t + 15$ . Here, company has to answer in two times: first, for the orders arrived up to instant  $t$  and second, for the orders arrived from  $t + 1$  to  $t + 10$ . The incompatibility graphs of these two sets of orders are the two clusters.

We continue the paper by assuming non-irrevocability in the construction of the on-line solution, i.e., by allowing backtracking. This means that the algorithm can interchange a number of vertices in the solution computed by a number of vertices not included in it. But we consider that changes performed imply a cost on the vertices changed. This, in our company example, becomes in deciding, at the last moment, to give some additional manufacturing work in its sub-contractors. But since it does not meet the deadline for these orders, it has to pay some extra cost. We study the competitiveness (against an optimal off-line algorithm) of two algorithms under two cost models. The former implies that the cost paid for any change is fixed, while the latter implies that for any vertex changed one has to pay a cost equal to the total number of vertices changed.

Finally, we study a slightly different on-line model, where we assume that the input-graph is revealed edge-by-edge. Together with the arrival of a new edge, are revealed the links of its endpoints with the ones of the edges already revealed. Here also we devise an on-line algorithm and study its competitiveness ratio against an optimal off-line one.

## 2 Basic definitions and notations

The following definitions will be frequently used throughout the paper. For reasons of legibility they are grouped here, before entering to its purely technical part.

**Matching.** A matching is a set of mutually disjoint edges of  $G$ .

**Exposed vertices.** A vertex is called exposed with respect to a matching  $M$ , if it is not endpoint of any edge of  $M$ , in other words, if it is not saturated by  $M$ .

**Augmenting path.** A path  $v_{i_1}, v_{i_2}, \dots, v_{i_k}$  is augmenting with respect to a maximal matching  $M$  if  $k$  is even,  $v_{i_1}, v_{i_k}$  are exposed with respect to  $M$  and if  $v_{i_l}v_{i_{l+1}} \in M$ ,  $l = 2q$ ,  $q = 1, \dots, (k-2)/2$ ; in other words, the set  $M \setminus \{v_{i_l}v_{i_{l+1}} : l = 2q, q = 1, \dots, (k-2)/2\} \cup \{v_{i_{l+1}}v_{i_{l+2}} : l = 2q, q = 1, \dots, (k-2)/2\}$  is also a matching with cardinality equal to  $|M|+1$ .

**Independent set.** An independent set is a subset of  $V' \subseteq V$  such that, for any  $(v_i, v_j) \in V' \times V'$ ,  $v_iv_j \notin E$ .

**Minimal (resp., maximal) set.** A set will be called minimal (resp., maximal) with respect to a property  $\pi$ , if it satisfies  $\pi$ , while deletion (resp., insertion) of an element from (resp., in)  $S$  results in a set not satisfying  $\pi$ .

**Fact 1.** ([3]) Any (maximal) independent set is the complement, with respect to  $V$ , of a (minimal) vertex-cover. ■

In what follows, we denote by  $\Delta$  the maximum degree of  $G$ , by  $\tau(G)$  the cardinality of a minimum vertex cover of  $G$ , by  $M$  (resp.,  $M_i$ ) a maximum matching of  $G$  (resp.,  $G_i$ ) and by  $P$  (resp.,  $P_i$ ) the set of the exposed vertices of  $G$  (resp.,  $G_i$ ) with respect to  $M$  (resp.,  $M_i$ ). Denote also by  $X(M)$  (resp.,  $X(M_i)$ ) the set of the endpoints of  $M$  (resp.,  $M_i$ ).

**Fact 2.** ([3]) Consider a graph  $G$ , fix a maximal matching  $M$  and let  $P = V \setminus X(M)$ . Then:

1.  $P$  is independent for  $G$ ;
2.  $X(M)$  is a vertex-cover of  $G$  with  $|X(M)| = 2m$ . ■

For  $v \in V$ , we denote by  $\Gamma(v)$  the set of neighbors of  $v$ , i.e.,  $\Gamma(v) = \{u : uv \in E\}$ ,  $\Delta = \max\{|\Gamma(v)| : v \in V\}$ .

### 3 On-line vertex-covering with $t = n$

We first consider that  $G$  is revealed into  $t = n$  clusters, i.e., vertex-by-vertex. Before specifying an on-line algorithm for this case, we establish a general result for any algorithm (on-line or off-line) computing a minimal vertex-cover, i.e., a vertex-cover that cannot be reduced by elimination of some of its vertices.

#### 3.1 On the approximation ratio of any minimal vertex-covering algorithm against maximum matching

We denote by `MAX_MATCHING` an algorithm computing a maximum matching  $M$  of  $G$  (the problem of finding a maximum matching of a graph is polynomial ([11])). By item 2 of fact 2,  $X(M) = \{v_i, v_j : v_iv_j \in M\}$  is a vertex-cover of size  $2|M|$  for  $G$ . Denote by  $m$  the size of  $M$ . Finally, set  $p = |P| = |V \setminus X(M)|$ . The following lemma will be used in theorem 1, just below, and later.

**Lemma 1.** *For any graph without isolated vertices,  $p \leq m(\Delta - 1)$ . If, in addition, the graph contains  $\iota$  isolated vertices, then  $p - \iota \leq m(\Delta - 1)$ .*

**Proof.** Fix an edge  $v_iv_j \in M$  such that at least one of  $v_i, v_j$  has neighbors in  $P$ . Let  $P_i = P \cap \Gamma(v_i) = \{p_{i_1}, p_{i_2}, \dots, p_{i_{|P_i|}}\}$ ;  $P_j$  is defined similarly. Suppose  $|P_i| \geq |P_j|$ . Then, if  $P_j \neq \emptyset$ , the following holds:

$$\begin{cases} P_j \subset P_i \\ |P_j| = 1 \end{cases} \quad (1)$$

In fact, suppose  $P_j \not\subseteq P_i$ . Then, there exists at least one vertex  $p_{j_k} \in P_j \setminus P_i$  and at least one vertex  $p_{i_l} \in P_i \setminus P_j$ . The path  $p_{i_l}, v_i, v_j, p_{j_k}$  is augmenting with respect to  $M$ , contradicting so the fact that  $M$  is maximum.

On the other hand, suppose  $P_j \subset P_i$  but  $|P_j| > 1$ . Then, with the same arguments, for any two vertices  $p_{i_l}$  and  $p_{j_k}$  in  $P_j \cap P_i$ , the path  $p_{i_l}, v_i, v_j, p_{j_k}$  is augmenting with respect to  $M$ .

Consider now the following graph  $B(N, E_B)$  constructed as follows:

- for every edge of  $M$  we draw a vertex (let  $N_M$  be the set of vertices so drawn); we also consider vertices of  $P$  as vertices of  $N$ ; in other words  $N = N_M \cup P$ ;
- let  $n_{ij}$  be the vertex of  $N_M$  associated with  $v_i v_j \in M$ ; if there exists an edge linking either  $v_i$  or  $v_j$  with a vertex  $p_k \in P$ , then  $n_{ij} p_k \in E_B$ .

By expression (1) and the discussion above, any  $n_{ij} \in N_M$  is linked with at most  $\Delta - 1$  vertices of  $P$  (the maximum degree of  $G$  is  $\Delta$  and one edge – the matching one – links  $v_i$  with  $v_j$ ). This remains true if  $P_j = \emptyset$ . Consequently,  $p \leq m(\Delta - 1)$ .

On the other hand, if  $G$  contains a set  $I$  of  $\iota$  isolated vertices, then the argument developed above remains valid on the graph  $G'(V \setminus I, E)$ , q.e.d. ■

Since  $n = 2m + p$  and, by lemma 1,  $p \leq m(\Delta - 1)$  (resp.,  $p - \iota \leq m(\Delta - 1)$ ), one easily gets  $n \leq m(\Delta + 1)$  (resp.,  $n - \iota \leq m(\Delta + 1)$ ) and reaches the following lemma.

**Lemma 2.** *In any graph with no isolated vertices,  $m \geq n/(\Delta + 1)$ . If the graph has  $\iota$  isolated vertices, then  $m \geq (n - \iota)/(\Delta + 1)$ .*

**Theorem 1.** *For any graph  $G$ , the ratio of the size of any minimal vertex-cover to the size of the vertex-cover induced by  $\text{MAX\_MATCHING}(G)$  is bounded above by  $\Delta/2$ .*

**Proof.** Assume first that  $G$  has no isolated vertices, denote by  $C$  a minimal vertex cover of  $G$  and by  $s$  the size of the independent set associated with  $C$ , i.e.,  $|V \setminus C| = s$ . Denote by  $m$  the size of a maximum matching  $M$  of  $G$ . By item 2 of fact 2, algorithm  $\text{MAX\_MATCHING}$  induces a vertex-cover of size  $2m$ . Recall finally that, by item 1 of fact 2,  $P = V \setminus X(M)$  is independent.

Since  $C$  is supposed minimal, the independent set  $V \setminus C$  is maximal. Consequently, using  $s \geq n/(\Delta + 1)$  ([3]), we get

$$|C| = n - s \leq (\Delta + 1)s - s = \Delta s \quad (2)$$

We now distinguish the following two cases depending on the values of  $s$  and  $m$ : (i)  $s \leq m$ , (ii)  $s > m$ .

For case  $s \leq m$ , using expression (2), we get:

$$\frac{|C|}{2m} \leq \frac{\Delta s}{2m} \leq \frac{\Delta}{2} \quad (3)$$

For case  $s \geq m$ , using lemma 1, we get:

$$\frac{|C|}{2m} = \frac{n - s}{2m} \leq \frac{2m + p - m}{2m} \leq \frac{m + m(\Delta - 1)}{2} = \frac{\Delta}{2} \quad (4)$$

Combining expressions (3) and (4), one proves the theorem.

Consider now that  $G$  contains a set  $I$  of isolated vertices. Then,  $C$  being minimal, it does not contain any isolated vertex. Furthermore,  $\text{MAX\_MATCHING}(G[V \setminus I]) = \text{MAX\_MATCHING}(G)$ . Hence the analysis performed just above remains valid and concludes the proof of the theorem. ■

It is well-known ([3]) that, for any graph  $G$  and for any maximal matching  $M$  (of cardinality  $m$ ) of  $G$ ,

$$\tau(G) \geq m \quad (5)$$

Consequently, by theorem 1, the following corollary holds immediately.

**Corollary 1.** *For any graph, the ratio of the size of any minimal vertex-cover to the size of the optimal one is bounded above by  $\Delta$ .*

### 3.2 An on-line algorithm for the case $t = n$

We are ready now to specify and analyze the following on-line algorithm for LVC.

```

BEGIN *OLVC*
  C  $\leftarrow$   $\emptyset$ ;
  t  $\leftarrow$  1;
  Gt  $\leftarrow$  ( $\{v_t\}, \emptyset$ );
  WHILE t < n DO
    v  $\leftarrow$  vt+1;
    t  $\leftarrow$  t + 1;
    Et  $\leftarrow$  Et  $\cup$  the set of edges linking v to vertices of Vt;
    Vt  $\leftarrow$  Vt  $\cup$  {vt+1};
    Gt  $\leftarrow$  (Vt, Et);
    IF  $\exists u \neq v : uv \in E_t \wedge u \notin C$  THEN C  $\leftarrow$  C  $\cup$  {v} FI;
  OD
  OUTPUT C;
END. *OLVC*
```

**Proposition 1.** *The competitiveness ratio of algorithm OLVC against an optimal off-line algorithm for VC is bounded above by  $\Delta$ , while its competitiveness ratio against MAX\_MATCHING (assuming that MAX\_MATCHING returns both a maximum matching  $M$  and  $X(M)$ ) is bounded above by  $\Delta/2$ . Both bounds are tight.*

**Proof.** Following algorithm OLVC,  $\forall v \in C, \exists uv \in E$  such that  $u \notin C$ . Hence, the vertex-cover  $C$  computed is minimal. Then, applications of corollary 1 and of theorem 1, respectively, conclude the ratios claimed.

Fix now a  $\Delta \in \mathbb{N}$ , consider a star  $S_{\Delta+1}$  on  $\Delta + 1$  vertices. Obviously,  $\tau(S_{\Delta+1}) = 1$ . Suppose that its center is the first vertex revealed; the rest of vertices can be revealed in any order. Then, algorithm OLVC will not include the star-center in  $C$ , while it will include all the remaining vertices of  $S_{\Delta+1}$ . Therefore, the competitiveness ratio achieved in this case is equal to  $\Delta$ . Furthermore, since  $\tau(S_{\Delta+1}) = m = 1$ , the competitiveness ratio  $\Delta/2$  against MAX\_MATCHING is also achieved. ■

### 3.3 Lower bounds on the competitiveness of any algorithm for the case $t = n$

Suppose that vertices are numbered in the order they arrive; in step  $i$ , vertex  $v_i$  is revealed. Also consider that, in step  $i$ ,  $\{v_1, \dots, v_i\} = C_i \cup S_i$ , where  $C_i$  draws the vertex-set included in the vertex cover under construction and  $S_i = \{v_1, \dots, v_i\} \setminus C_i$ . The final graph is denoted, as usually, by  $G(V, E)$  and its maximum degree by  $\Delta$ . The purpose of this section is to provide limits in the competitiveness (against an optimal off-line algorithm) of any on-line algorithm solving LVC with  $t = n$  (over all the ways the input-graph is revealed). Let us consider the solution of LVC as a two-players game, where the first one (player 1) reveals the instance and the second one (player 2) constructs the solution. Then, we prove the following theorem.

#### Theorem 2.

1. *No algorithm can achieve competitiveness ratio strictly better than  $\Delta$ , even if an isomorphic of  $G$  is known in advance.*

2. No algorithm can achieve competitiveness ratio strictly better than  $\Delta - 2$ , even if  $G$  is a tree and  $n$  is known in advance.

**Proof of item 1.** The isomorphic of  $G$  revealed in advance consists of a disjoint collection of  $p$  stars, each of order  $\Delta + 1$  and of  $\Delta - 1$  isolated vertices, where  $\Delta$  and  $p$  are fixed integers. Obviously, the degree of  $G$  is  $\Delta$  and its order  $n = p(\Delta + 1) + \Delta - 1$ . Assume that player 1 reveals the graph with respect to the following rules:

- i** if  $C_i$  contains  $\Delta$  isolated vertices (for the graph already revealed), then  $v_{i+1}$  is linked to all these vertices;
- ii** if  $v_i \in S_i$  (in other words,  $v_i$  has not been taken in the solution) and  $v_i$  is not linked to any vertex  $v_j$ ,  $j < i$ , and if  $i \leq n - \Delta$ , then vertices  $v_i, v_{i+1}, \dots, v_{i+\Delta}$  form a star rooted in  $v_i$ ;
- iii** if  $p$  stars have been revealed, the rest of the vertices revealed are isolated;
- iv** if rules **i** and **ii** cannot be applied and  $i \leq n - 1$ , then vertex  $v_{i+1}$  is isolated with respect to the graph already revealed.

Applications of rules **i** to **iv** above implies that player 2 cannot do better than covering edges of any star by its leaves, while optimal off-line solution consists of the star-centers. Therefore a ratio of  $\Delta$  is achieved at best and this completes the proof of item 1 of the theorem.

**Proof of item 2.** Let  $\Delta$  be an integer greater than, or equal to, 3 and set  $n = \Delta(\Delta + 1) + 1$ . Consider that player 1 reveals the graph following the rules below:

- (i)** if  $C_i$  contains  $\Delta$  isolated vertices (with respect to the graph already revealed) and  $i \leq n - 2$ , then  $v_{i+1}$  is linked to all these isolated vertices;
- (ii)** if  $v_i \in S_i$  (in other words,  $v_i$  has not been taken in the solution) and  $v_i$  is not linked to any vertex  $v_j$ ,  $j < i$ , and if  $i \leq n - \Delta - 1$ , then vertices  $v_i, v_{i+1}, \dots, v_{i+\Delta}$  form a star rooted in  $v_i$ ;
- (iii)** consider  $v_i \in S_i$ ,  $v_i$  isolated with respect to the graph already revealed, and  $n - 2 \geq i \geq n - \Delta$ ; set  $A = \{v_j : j < i, v_j \in C_i, \forall k \leq i, v_j v_k \notin E\}$  (i.e.,  $A$  is the set of the isolated vertices, at instant  $t$ , taken in  $C_i$ ) and  $B = \{v_{i+2}, \dots, v_{n-1}\}$ ; then:
  - (a)  $v_{i+1}$  is linked to  $v_i$  and to any element of set  $A$ ;
  - (b) the elements of  $B$  form an independent set and are linked to  $v_i$
- (iv)** if rules **(i)** and **(ii)** do not apply and if  $i \leq n - \Delta$ , then vertex  $v_{i+1}$  is isolated with the graph already revealed;
- (v)**  $v_n$  is linked to  $\Delta$  vertices of degree 1 picked in the several connected components of the graph revealed until step  $n - 1$ .

In figure 1 a graph  $G$  fitting rules **(i)** to **(v)** is shown for  $n = 31$  and  $\Delta = 5$ . Vertices are numbered in the order they have been revealed. Here, rule **(iii)** is applied for vertex 27. Then,  $A = \{19, 20\}$  and  $B = \{29, 30\}$ . The circle vertices represent the LVC-solution, while the square ones represent the independent set associated with it. A graph fitting item 1 of the theorem could be as the one of figure 1 induced by the set of vertices  $\{1, \dots, 27\}$  plus one isolated square vertex.

If rule **(iii)** is not applied, then in step  $n - 1$ , the graph contains  $\Delta$  stars, their vertices of degree 1 making part of the solution constructed by player 2. In this case,  $\tau(G) = \Delta + 1$  (the roots of

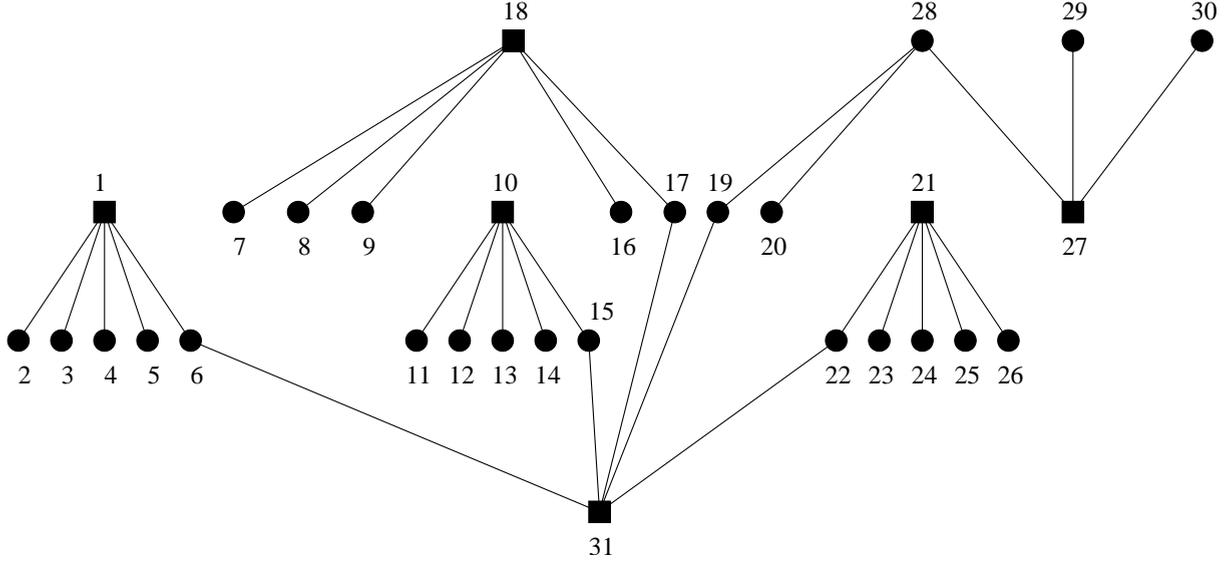


Figure 1: A graph fitting rules (i) to (v) with  $n = 31$  and  $\Delta = 5$ .

the stars plus vertex  $v_n$ ), while the solution constructed is of size  $\Delta(\Delta + 1)$ . The competitiveness ratio is in this case  $\Delta$ .

Suppose now that rule (iii) is applied (recall that this is the case for vertex 27 in figure 1). Then in step  $i$ , the graph consists of  $k$  stars (their leaves making part of the solution constructed by player 2) plus the vertices of  $A \cup \{i\}$ . In this case, the total number of vertices verifies  $n = \Delta(\Delta + 1) + 1 = k(\Delta + 1) + |A| + |B| + 3$ , with  $|A| < \Delta$  (if not, rule (i) would be applied one more time) and  $|B| \leq \Delta - 2$  (because  $i \geq n - \Delta$ ). We deduce  $k = \Delta - 1$ . In this case,  $\tau(G) = \Delta - 1 + 3 = \Delta + 2$ , while the solution finally constructed by player 2 has at least  $(\Delta - 1)\Delta + \Delta = \Delta^2$  vertices (the leaves of the  $\Delta - 1$  stars plus set  $A$  plus set  $B$  plus  $x_{i+1}$ ). The competitiveness ratio implied is then at least  $\Delta - 2$ . In figure 1,  $\tau(G) = 7$  (the optimal solution is the set  $\{1, 10, 18, 21, 27, 28, 31\}$ , while the solution constructed by player 2 (the set of the circle vertices of figure 1) is of cardinality 25).

In order to conclude, let us note that the graph at step  $n - 1$  consists of  $\Delta$  acyclic connected components, each of them containing at least one vertex of degree 1. This makes that rule (v) is feasible and guarantees that the final graph is a tree. So, the proofs of item 2 and of the theorem are complete. ■

## 4 On-line vertex covering with $n > t \geq 2$

We assume in this section that  $G$  is revealed by non-empty clusters  $G_i$ ,  $i = 1, \dots, t$ , with  $2 \leq t < n$ . We first study the case  $t > 2$ . The case  $t = 2$ , being interesting by itself, is examined separately in section 4.2. We suppose that  $t$  is known at the beginning of the game.

### 4.1 On-line vertex covering with $n > t > 2$

For the case we deal with in this section, we propose the following algorithm.

```

BEGIN *t_OLVC*
*arrival of  $G_1$ *
(1)  $C \leftarrow X(\text{MAX\_MATCHING}(G_1));$ 
*arrival of  $G_i, i = 2 \dots, t$ *

```

```

(2)  FOR i ← 2 TO t DO
(3)    C ← C ∪ X(MAX_MATCHING(Gi));
(4)    FOR u ∈ Vi \ X(MAX_MATCHING(Gi)) DO
(5)      IF ∃v ∈ (∪1 ≤ j ≤ i-1 Vj) \ C : uv ∈ E THEN C ← C ∪ {u} FI
(6)    OD
(7)  OD
(8)  OUTPUT C
END  *t_OLVC*

```

Obviously, the set  $C$  finally computed by  $\mathbf{t\_OLVC}$  is a vertex-cover, although not necessarily minimal. So, proposition 1 does not represent the worst case for its competitiveness ratio. Note that for the case where clusters are assumed without any restriction, setting  $|C| \leq n - |I|$  (where  $I$  denotes the set of isolated vertices, if any) and using lemma 2, competitiveness ratio  $\Delta + 1$  is immediately deduced.

**Theorem 3.** *Let  $\lambda_i$  be the number of the isolated vertices of  $G_i$  introduced in  $C$  and set  $\lambda = \sum_{i=1}^t \lambda_i$  and  $\rho = \lambda/|A|$ . Then, the competitiveness ratio of algorithm  $\mathbf{t\_OLVC}$  against an optimal VC algorithm is bounded above by  $2 + (\Delta - 2)/(2 - \rho)$ .*

**Proof.** Denote by  $A_i$ ,  $i = 2, \dots, t$ , the vertex-sets introduced in  $C$  during the execution of lines (4) to (6) of algorithm  $\mathbf{t\_OLVC}$  and set  $A = \cup_{i=2}^t A_i$ . Observe that vertex-set  $A$  is exposed with respect to the (non-maximum) matching  $\cup_{i=1}^t M_i$ ; moreover, it does not contain any isolated vertex. Observe also that any isolate vertex is exposed with respect to any matching of  $G$ ; hence

$$\lambda \leq |A| \iff \rho \leq 1 \quad (6)$$

Denote by  $M_i$ ,  $i = 1, \dots, t$ , a maximum matching of  $G_i$ , set  $m_i = |M_i|$ ,  $i = 2, \dots, t$ . Then, the cardinality of the on-line solution  $C$  computed by  $\mathbf{t\_OLVC}$  can be written as follows:

$$|C| = 2 \sum_{i=1}^t m_i + |A| \quad (7)$$

Let  $E'$  be the set of edges that have entailed introduction of the vertices of  $A$  in  $C$  and denote by  $B(A \cup (V_1 \setminus X(M_1)), E')$  the partial subgraph of  $G$  induced by  $A \cup (V_1 \setminus X(M_1))$  and by  $E'$ . Also, denote by  $M_B$  a maximum matching of  $B$  and by  $m_B$  the cardinality of  $M_B$ . Remark also that  $M_B \cup_{i=1}^t M_i$  is a matching of  $G$ , not necessarily maximum, and that the graph  $B$  is bipartite with color-classes  $A$  and  $V_1 \setminus X(M_1)$ . Expression (5) can, for the purposes of our proof, be rewritten as

$$\tau(G) \geq \left( \sum_{i=1}^t m_i \right) + m_B \quad (8)$$

and, using expressions (7) and (8), the competitiveness ratio of  $\mathbf{t\_OLVC}$  becomes

$$c_{\mathbf{t\_OLVC}} = \frac{|C|}{\tau(G)} \leq \frac{|C|}{\left( \sum_{i=1}^t m_i \right) + m_B} = \frac{2 \sum_{i=1}^t m_i + |A|}{\left( \sum_{i=1}^t m_i \right) + m_B} = 2 + \frac{|A| - 2m_B}{\left( \sum_{i=1}^t m_i \right) + m_B} \quad (9)$$

Finally, using lemma 2, we get

$$m_B \geq \frac{|A \cup (V_1 \setminus X(M_1))|}{\Delta} \geq \frac{|A|}{\Delta} \quad (10)$$

On the other hand, let  $i \in \{1, \dots, t\}$  and let  $I$  be the set of the isolated vertices of cluster  $G_i$ . We then have  $|I| = \lambda_i + (|I| - |A_i \cap I|)$ , or  $|A_i| - \lambda_i = |A_i| + (|I| - |A_i \cap I|) - |I| \leq p_i - |I| \leq m_i(\Delta - 1)$ , where the first inequality holds because  $A_i \subseteq P_i$  and, as we have already mentioned in the beginning of the proof, the set  $I \setminus (A_i \cap I)$ , being isolated in  $G_i$ , it is exposed with respect to any matching of  $G_i$ ; the second inequality holds thanks to lemma 1. Summing inequalities  $|A_i| - \lambda_i \leq m_i(\Delta - 1)$  for  $i = 1, \dots, t$ , we obtain

$$\sum_{i=1}^t m_i \geq \frac{|A| - \lambda}{\Delta - 1} \quad (11)$$

Using expressions (6), (10) and (11), expression (9) becomes

$$\begin{aligned} c_{\mathfrak{t\_OLVC}} &\leq 2 + \frac{|A| - 2m_B}{\left(\sum_{i=1}^t m_i\right) + m_B} \leq 2 + \frac{|A| - \frac{2|A|}{\Delta}}{\frac{|A| - \lambda}{\Delta - 1} + \frac{|A|}{\Delta}} \\ &\leq 2 + \frac{\frac{\Delta - 2}{\Delta}}{\frac{\Delta(1 - \rho) + \Delta - 1}{\Delta(\Delta - 1)}} = 2 + \frac{(\Delta - 2)(\Delta - 1)}{\Delta(2 - \rho) - 1} \leq 2 + \frac{\Delta - 2}{2 - \rho} \end{aligned} \quad (12)$$

and the proof of the theorem is complete. ■

Recall that  $\rho \leq 1$  (expression (6)). Furthermore, expression (12) is increasing with  $\rho$ ; hence, setting  $\rho = 1$  the following result is immediately obtained.

**Corollary 2.** *The competitiveness ratio of algorithm  $\mathfrak{t\_OLVC}$  against an optimal VC algorithm is bounded above by  $\Delta$ .*

On the other hand, consider that clusters arrive without isolated vertices. In this case, for any  $i = 1, \dots, t$ ,  $\lambda_i = 0$ , so,  $\rho = 0$  and, using expression 12, the following holds.

**Corollary 3.** *Whenever clusters arrive without isolated vertices, the competitiveness ratio of algorithm  $\mathfrak{t\_OLVC}$  against an optimal VC algorithm is bounded above by  $(\Delta + 2)/2$ .*

Note that the solution  $C$  computed by algorithm  $\mathfrak{t\_OLVC}$  is not necessarily minimal. Consequently, the result of corollary 2 cannot be derived by direct application of corollary 1.

The bound of corollary 3 can be slightly improved by the following way. Since, for  $i = 1, \dots, t$ , the vertices of  $A_i$  are exposed with respect to  $M_i$ , using lemma 1 ( $A_i \cap I = \emptyset$ ), we get

$$|A_i| \leq m_i(\Delta - 1) \quad (13)$$

On the other hand, since no cluster contains isolated vertices, the bipartite graph  $B(A \cup (V_1 \setminus X(M_1)), E')$  considered in the proof of theorem 3 has maximum degree bounded above by  $\Delta - 1$  (at least one edge per vertex in  $A \cup (V_1 \setminus X(M_1))$ , links it to vertices of  $X(M_i)$ ,  $i = 1, \dots, t$ ). Consequently,

$$|A| \leq (\Delta - 1) |V_1 \setminus X(M_1)| \leq (\Delta - 1)m_B \quad (14)$$

where the last inequality holds because, in a bipartite graph, the cardinality of a maximum matching is smaller than the cardinality of the smallest among the color-classes. So, combining expressions (13) and (14), expression (9) becomes:

$$c_{\mathfrak{t\_OLVC}} \leq 2 + \frac{|A| - 2m_B}{\left(\sum_{i=1}^t m_i\right) + m_B} \leq 2 + \frac{|A| - 2\frac{|A|}{\Delta - 1}}{\frac{2|A|}{\Delta - 1}} = 2 + \frac{\Delta - 3}{2} = \frac{\Delta + 1}{2} \quad (15)$$

and expression (15) leads immediately to the following final corollary.

**Corollary 4.** *Whenever clusters arrive without isolated vertices, the competitiveness ratio of algorithm  $\mathfrak{t\_OLVC}$  against an optimal VC algorithm is bounded above by  $(\Delta + 1)/2$ .*

## 4.2 On-line vertex-covering with $t = 2$

Suppose now that the input graph is revealed within two clusters  $G_1(V_1, E_1)$  and  $G_2(V_2, E_2)$ . Assume also that  $n$ , the order of the final graph, is known at the beginning of the game. We recall that, following our assumptions, one has to decide which vertices of the first cluster will belong to the final solution before the arrival of the second cluster.

### 4.2.1 $G$ has no isolated vertices

In this section we suppose that no additional hypotheses are admitted on the forms of the clusters and analyze the competitiveness ratio of the following algorithm.

```

BEGIN *2_OLVC*
*arrival of  $G_1$ *
(1) CASE  $V_1 \leq n/2$  DO  $C \leftarrow V_1$ ;
(2)                GOTO (6);
(3)      $V_1 > n/2$  DO  $C \leftarrow X(\text{MAX\_MATCHING}(G_1))$ ;
(4)                GOTO (7);
(5) OD
*arrival of  $G_2$ *
(6) OUTPUT  $C \leftarrow C \cup X(\text{MAX\_MATCHING}(G_2))$ ;
(7) OUTPUT  $C \leftarrow C \cup V_2$ ;
END. *2_OLVC*
```

**Theorem 4.** *If  $G$  has no isolated vertices, then the competitiveness ratio of algorithm 2\_OLVC against an optimal VC algorithm verifies  $c_{2\_OLVC} \leq (\Delta + 5)/2$ . This ratio is tight.*

**Proof.** Denote, for  $i = 1, 2$ , by  $M_i$  the matchings computed by algorithm MAX\_MATCHING on  $G_i$  at lines (3) and (6) and by  $m_i$  their sizes.

Suppose lines (1) and (2) of algorithm 2\_OLVC are executed. Then, the solution returned is  $C = V_1 \cup X(M_2)$  with  $|C| \leq n/2 + 2m_2$ . Combining expression for  $C$  with expression (5) and taking into account lemma 2 and the fact that  $m_2 \leq m$ , the following holds:

$$c_{2\_OLVC} = \frac{|C|}{\tau(G)} \leq \frac{\frac{n}{2} + 2m_2}{m} \leq \frac{n}{2m} + 2 \leq \frac{\Delta + 1}{2} + 2 = \frac{\Delta + 5}{2} \quad (16)$$

Suppose now that lines (3) and (4) of algorithm 2\_OLVC are executed instead. Then,  $|V_2| \leq n/2$  and the solution returned is the one of line (7), i.e.,  $C = X(M_1) \cup V_2$ . In this case also the arguments previously developed hold. Hence, expression (16) always gives the competitiveness ratio achieved.

Let us now show that the analysis above is asymptotically tight. Consider a graph  $G(V, E)$  collection of  $R$  stars, each of maximum degree  $\Delta$ . Consider the subgraph  $G_1$  of  $G$  consisting of a set of  $n/2$  exposed vertices with respect to a maximum matching  $M$  of  $G$ . Remark that  $M$  contains one edge per star and that  $V(G_1)$  is a set of isolated vertices of size not larger than  $n/2$ . Set  $G_2 = G[V \setminus V(G_1)]$  and assume that  $G$  is revealed per clusters  $G_1$  and  $G_2$ . Then,

$$|C| = \frac{n}{2} + 2R = \frac{n}{2} + \frac{2n}{\Delta + 1} \quad (17)$$

$$\tau(G) = \frac{n}{\Delta + 1} = R \quad (18)$$

$$\frac{|C|}{\tau(G)} = \frac{\Delta + 5}{2} \quad (19)$$

This completes the proof of the theorem. ■

### 4.2.2 Clusters have no isolated vertices

Suppose now that clusters  $G_i$  arrive with no isolated vertices. Let  $n_i$  be the order of  $G_i$ . Denote by  $M_i$ ,  $i = 1, 2$ , a maximum matching of  $G_i$ , by  $P_i$  the set of the exposed vertices with respect of  $M_i$ , by  $p_i$  its cardinality and consider the following on-line algorithm.

```

BEGIN *C2_OLVC(n, ε)*
(1)  fix an ε > 1;
(2)  C ← ∅;
*arrival of G1*
(3)  M1 ← MAX_MATCHING(G1);
(4)  IF n1 ≤ n/ε THEN C ← C ∪ V1;
(5)  ELSE C ← C ∪ X(M1);
*arrival of G2*
(6)  M2 ← MAX_MATCHING(G2);
(7)  C ← C ∪ X(M2);
(8)  A2 ← {v ∈ V2 \ X(M2) : ∃u ∈ V1 \ C, uv ∈ E};
(9)  OUTPUT C ← C ∪ A2;
END. *C2_OLVC(n, ε)*

```

**Theorem 5.** *Under the hypothesis that clusters arrive with no isolated vertices, there exists  $\epsilon_0$ , the largest among the roots of the polynomial  $\epsilon^2 - 3\epsilon + 1$ , such that the competitiveness ratio of algorithm C2\_OLVC( $n, \epsilon_0$ ) against an optimal VC algorithm is bounded above by  $2 + ((\Delta + 1)/\epsilon_0)$ .*

**Proof.** Set, for  $i = 1, 2$ ,  $m_i = |M_i|$  and note the following fact that can be immediately deduced from algorithm C2\_OLVC.

**Fact 3.** Whenever line (4) is executed, then line (8) computes  $A_2 = \emptyset$ ; therefore the final covering  $C$  computed in line (9) satisfies  $C = V_1 \cup X(M_2)$ . ■

Let us first suppose that line (4) is executed. Then, using fact 3, expression (5) and lemma 2, we get:

$$\frac{|C|}{\tau(G)} = \frac{n_1 + 2m_2}{m} \leq \frac{\frac{n}{\epsilon} + 2m_2}{m} \leq \frac{\frac{n}{\epsilon}}{m} + 2 \leq \frac{\frac{n}{\epsilon}}{\frac{n}{\Delta+1}} + 2 = \frac{\Delta + 1}{\epsilon} + 2 \quad (20)$$

Let us now suppose that line (5) is executed instead. Then, the set  $C$  finally computed in line (9) by algorithm C2\_OLVC verifies:

$$|C| = |X(M_1)| + |X(M_2)| + |A_2| = 2(m_1 + m_2) + |A_2| \quad (21)$$

Denote by  $Q_1 \subseteq V_1 \setminus X(M_1)$  the set of vertices of  $V_1$  that has entailed the introduction of set  $A_2$  in  $C$ , and by  $B(Q_1, A_2, E_B)$ , the subgraph of  $G$  induced by  $Q_1 \cup A_2$ . Since they are both independent (subsets of  $P_1$  and  $P_2$ , respectively),  $B$  is bipartite. Denote also by  $M_B$  a maximum matching of  $B$  and set  $m_B = |M_B|$ . Since  $M_1 \cup M_2 \cup M_B$  is a matching for  $G$ ,

$$\tau(G) \geq m_1 + m_2 + m_B \quad (22)$$

Consider set  $X(M_B) \cap Q_1$ ; obviously,  $|X(M_B) \cap Q_1| = m_B$ . Since  $G_1$  is supposed without isolated vertices, any vertex of  $X(M_B) \cap Q_1$  has at most  $\Delta - 1$  neighbors in  $A_2$ . On the other hand,  $M_B$  being maximum for  $B$ , any vertex of  $A_2$  receives edges from at least one vertex of  $X(M_B) \cap Q_1$ . So,

$$|A_2| \leq m_B(\Delta - 1) \quad (23)$$

Also, since  $G_1$  and  $G_2$  are both assumed without isolated vertices, application of lemma 2 gives:

$$\begin{aligned} m_1 &\geq \frac{n_1}{\Delta+1} \\ m_2 &\geq \frac{n_2}{\Delta+1} \end{aligned} \quad (24)$$

Combining expressions (21), (22), (23) and (24), performing some little and easy algebra and taking into account  $n_1 + n_2 = n$ , one gets:

$$\frac{|C|}{\tau(G)} \leq \frac{2(m_1 + m_2) + |A_2|}{m_1 + m_2 + m_B} = 2 + \frac{|A_2| - 2m_B}{m_1 + m_2 + m_B} \leq 2 + \frac{\frac{\Delta-3}{\Delta-1}|A_2|}{\frac{n}{\Delta+1} + \frac{|A_2|}{\Delta-1}} \quad (25)$$

Recall that we are currently considering case  $n_1 \geq n/\epsilon$ , i.e.,

$$n_2 \leq n - \frac{n}{\epsilon} = n \frac{\epsilon - 1}{\epsilon} \quad (26)$$

Using expression (24) for  $m_2$ , denoting by  $p_2$  the number of the exposed vertices of  $V_2$  with respect to  $M_2$ , and using expression (26), we obtain

$$|A_2| \leq p_2 = n_2 - 2m_2 \leq n_2 - \frac{2n_2}{\Delta+1} = \frac{\Delta-1}{\Delta+1}n_2 \leq \frac{(\Delta-1)(\epsilon-1)}{(\Delta+1)\epsilon}n \quad (27)$$

Remark also that expression (25) is increasing with  $|A_2|$ . So, combining expressions (25) and (27):

$$\frac{|C|}{\tau(G)} \leq 2 + \frac{\frac{(\Delta-3)(\epsilon-1)}{(\Delta+1)\epsilon}n}{\frac{n}{\Delta+1} + \frac{(\epsilon-1)n}{\epsilon(\Delta+1)}} = 2 + \frac{(\Delta-3)(\epsilon-1)}{2\epsilon-1} \quad (28)$$

Note that, for a fixed  $\epsilon$ ,  $(\Delta-3)(\epsilon-1)/(2\epsilon-1) \leq (\Delta+1)(\epsilon-1)/(2\epsilon-1)$  and that expression (20) is decreasing with  $\epsilon$ , while expression (28) is increasing. These two expressions asymptotically coincide when

$$\frac{\Delta+1}{\epsilon} + 2 = 2 + \frac{(\Delta+1)(\epsilon-1)}{2\epsilon-1} \iff \epsilon^2 - 3\epsilon + 1 = 0 \xrightarrow{\epsilon > 1} \epsilon_0 \simeq 2.62 \quad (29)$$

Setting  $\epsilon_0 = 2.62$ , we get  $c_{c2\_OLVC} \leq (\Delta+6.24)/2.62$ . This, for large values of  $\Delta$ , is asymptotically equal to  $\Delta/2.62$ . ■

### 4.3 Lower bounds for the competitiveness ratio

#### 4.3.1 Case $t > 2$

We provide in this section a competitiveness upper bound, given in theorem 6, for the case where the number of clusters needed for the revealing of the whole graph is  $O(\log n \sqrt{n})$ . The proof of the theorem being quite technical, it is given in appendix.

**Theorem 6.** *When  $t = O(\log n \sqrt{n})$ , and any cluster is non-empty, no on-line algorithm for LVC can achieve competitiveness ratio smaller than  $\Delta - 2$  against an optimal off-line algorithm, even if the input-graph is a tree and  $n$  is known in advance.*

#### 4.3.2 Limits on the competitiveness for $t = 2$

As previously in section 3.3, we bring to the fore a graph and a strategy for revealing it in two steps such that every on-line VC-algorithm cannot achieve competitiveness ratio better than the bound provided.

**Theorem 7.** For  $t = 2$  and for all  $\Delta \geq 2$ , no algorithm can achieve competitiveness ratio strictly better than  $(\Delta + 1)/2$  for a graph of maximum degree  $\Delta$ , even if it is bipartite with no isolated vertices, both clusters have the same size and an isomorphic of the input-graph is known in advance.

**Proof.** Given an integer  $k$  and two sets  $A = \{1, \dots, |A|\}$  and  $B = \{1, \dots, |B|\}$  such that  $|B| = k|A|$ , we set  $A \times_k B = \{(a_i b_{(i-1)k+j}) \in A \times B, i \in \{1, \dots, |A|\}, j \in \{1, \dots, k\}\}$ . In other words, if  $A$  and  $B$  are vertex-sets, the graph  $(A \cup B, A \times_k B)$  consists of  $|A|$  stars of size  $k + 1$  rooted in the vertices of  $A$ .

Let  $\Delta \geq 2$  be a fixed integer and set

$$n = 2\Delta(\Delta + 1) \quad (30)$$

We define  $H = (V_1 \cup V_2, E)$  where:

- $V_1 = N_1^1 \cup N_1^2$  (sets  $N_1^1$  and  $N_1^2$  are mutually disjoint) with  $|N_1^1| = \Delta$ ,  $|N_1^2| = \Delta^2$ ,  $N_1^1 \cap N_1^2 = \emptyset$ ;
- $V_2 = N_2^1 \cup N_2^2$  (sets  $N_2^1$  and  $N_2^2$  are mutually disjoint) with  $|N_2^1| = \Delta^2$ ,  $|N_2^2| = \Delta$ ,  $N_2^1 \cap N_2^2 = \emptyset$ ;
- $E = (N_1^1 \times_{\Delta} N_2^1) \cup (N_2^2 \times_{\Delta} N_1^2)$ .

The so-constructed graph  $H$  is bipartite, without isolated vertices and a minimum cardinality vertex covering of  $H$  is of size  $\tau(H) = n/(\Delta + 1)$ .

Let us consider an on-line algorithm OLVC. We will show that there exists a bipartite graph  $G(V_1, V_2, E)$  isomorphic to  $H$  for which the competitiveness ratio of OLVC is at least  $(\Delta + 1)/2$  when  $V_1$  is revealed in step 1 and  $V_2$  is revealed in step 2. More precisely, the solution computed by OLVC in  $G$  contains at least  $n/2$  vertices, where  $n = |V_1| + |V_2|$ . Assume  $|V_1| = n/2$ , let  $N_1$  be the set of vertices of  $V_1$  introduced in the solution by OLVC and set  $n_1 = |N_1|$ . Define integers  $p, r, k$  such that

$$n_1 = p\Delta + r \quad (31)$$

$$r \leq \Delta - 1 \quad (32)$$

$$k = (\Delta + 1) - p \quad (33)$$

Note that  $k \geq 0$  and that, using expressions (30) and (33), one gets the following expression (34); expression (35) is immediate by the discussion above:

$$(k + p)\Delta = \frac{n}{2} \quad (34)$$

$$k \leq \frac{n}{2} - n_1 \quad (35)$$

Indeed, expression (35) obviously holds if  $k = 0$  ( $n_1 = n/2$ ), or  $k = 1$  ( $n_1 < n/2$ ). Suppose now  $k \geq 2 \geq \Delta/(\Delta - 1)$ . We then have, using expressions (31) to (33):

$$\frac{n}{2} - n_1 = \Delta(\Delta + 1) - p\Delta - r > \Delta(\Delta - p) = \Delta(k - 1) \geq k \quad (36)$$

Set  $V_1$  as the partition of sets  $N_1^p, N_1^k$  and  $R_1$ , where  $N_1^p \subset N_1$ ,  $N_1^k \cap N_1 = \emptyset$  and

$$\begin{cases} |N_1^p| &= p\Delta \\ |N_1^k| &= k \end{cases} \quad (37)$$

Such decomposition is possible because of expression (35). Then,  $|R_1| = k(\Delta - 1)$  and we have:

$$V_1 = N_1^p \cup N_1^k \cup R_1 \quad (38)$$

Set also  $V_2$  as the partition of sets  $N_2^p$ ,  $N_2^k$  and  $R_2$  where  $|N_2^p| = p$ , and  $|N_2^k| = \Delta k$ . Then  $|R_2| = p(\Delta - 1)$ . In all,

$$V_2 = N_2^p \cup N_2^k \cup R_2 \quad (39)$$

We now consider three cases, namely, (i)  $k > 0$  and  $p > 0$ , (ii)  $k = 0$  and (iii)  $p = 0$ .

For case (i) ( $k > 0$  and  $p > 0$ ), using expression (34),  $p\Delta < \Delta(\Delta + 1)$  and, consequently,  $p \leq \Delta$ . Then, we set  $a = p - 1$  and  $b = \Delta - p$ ;  $a$  and  $b$  are positive integers satisfying:

$$\begin{cases} k(\Delta - 1) &= a + b\Delta \\ p(\Delta - 1) &= a\Delta + b \end{cases} \quad (40)$$

Revisit expressions (38) and (39) and set  $R_1 = R_1^a \cup R_1^b$ ,  $R_2 = R_2^a \cup R_2^b$  with  $|R_1^a| = a$ ,  $|R_1^b| = b\Delta$ ,  $|R_2^a| = a\Delta$ ,  $|R_2^b| = b$  where  $a$  and  $b$  are as in expression (40); consider also that  $R_1^a$ ,  $R_1^b$ ,  $R_2^a$ , and  $R_2^b$  are mutually disjoint. Furthermore, the edge-set  $E$  of  $G$  is considered as follows:  $E = N_2^p \times_{\Delta} N_1^p \cup N_1^k \times_{\Delta} N_2^k \cup R_1^a \times_{\Delta} R_2^a \cup R_2^b \times_{\Delta} R_1^b$ . For  $G$  (which is isomorphic to  $H$ ), the on-line solution computed by OLVC necessarily contains set  $N_1 \cup N_2^k$  of cardinality at least  $n/2$ . On the other hand,  $N_2^p \cup N_1^k \cup R_1^a \cup R_2^b$  is a minimum-size vertex cover.

For case (ii) ( $k = 0$ ), expression (33) gives  $p = \Delta + 1$  and expression (37) implies  $n_1 = n/2$ . Then  $E$  is defined so that  $G$  is isomorphic to  $H$ .

For case (iii) ( $p = 0$ ), by expressions (32) and (36),  $n/2 - n_1 > \Delta(\Delta + 1) - \Delta \geq \Delta$ . So we can define  $N_1^1$ ,  $N_1^2$ ,  $N_2^1$  and  $N_2^2$  as in  $H$  (see the three items at the beginning of the proof) with the supplementary condition that  $N_1^1 \cap N_1 = \emptyset$ .

In all of the above cases, the on-line solution computed by OLVC contains at least  $n/2$  vertices. On the other hand, the corresponding graphs  $G$  being isomorphic to  $H$ ,  $\tau(G) = n/(\Delta + 1)$ . Consequently, the competitiveness ratio of OLVC is at least  $(\Delta + 1)/2$ , and the proof of the theorem is complete. ■

Note that if we allow isolated vertices in  $G$ , one can easily show that one cannot guarantee competitiveness ratio strictly better than  $1/\Delta$ .

## 5 Allowing backtracking

In this section we somewhat change the working hypotheses adopted and suppose that one can go back over the solution constructed during previous steps. We assume that one can change this solution but she/he has to pay some cost for doing it.

Our on-line algorithm for the case of the backtracking is basically algorithm  $\tau$ \_OLVC. The spirit of our thought process can be outlined as follows. The best approximation ratio known for VC is bounded above by 2 (this ratio is equal to  $2 - (\log \log n / \log n)$  ([2])). On the other hand, LVC being computationally harder, it is a priori worse approximated than VC. So, one can “restrain” her/himself in searching for competitiveness ratios as near as possible to 2. The maximum matching performed on each cluster of  $G$  by algorithm  $\tau$ \_OLVC obviously guarantees approximation ratio 2 on any cluster. The fact that the whole competitiveness ratio is finally “deteriorated” is due to the vertices of the graph  $B$  that have to be taken into account in order to cover cross-edges, i.e., edges between clusters. So the algorithm we propose in what follows starts with running MAX\_MATCHING on each cluster and by delaying its decision on the cross-edges (in other words, the exposed vertices of any cluster are firstly considered as not belonging to the solution under construction). Next, once all clusters revealed, graph  $G_B$  is formed and MAX\_MATCHING( $B$ ) is run. The final solution is the union of the endpoints of all the edges retained

by the successive runs of `MAX_MATCHING`. In what follows, for  $V' \subseteq V$ , we denote by  $G[V']$  the subgraph of  $G$  induced by  $V'$ .

```

BEGIN *Bt_OLVC*
  C ← ∅;
  FOR i ← 1 TO t DO C ← C ∪ X(MAX_MATCHING(Gi)) OD
  B ← G[∪i=1t(Vi \ X(MAX_MATCHING(Gi)))] ;
  OUTPUT C ← C ∪ X(MAX_MATCHING(B));
END   *Bt_OLVC*

```

Let us denote by  $\kappa$  the cost due to the change of the status of a non-covering vertex to a covering one. Also, as previously, we denote by  $M_i$  the edge-set computed by `MAX_MATCHING`( $G_i$ ) and by  $m_i$  its cardinality,  $i = 1, \dots, t$ ; furthermore, we denote by  $M_B$  the edge-set computed by `MAX_MATCHING`( $B$ ) and by  $m_B$  its cardinality.

**Theorem 8.** *The competitiveness ratio of algorithm `Bt_OLVC` against an optimal off-line algorithm for VC is bounded above by  $2\kappa$ .*

**Proof.** As one can see from algorithm `Bt_OLVC`, the vertices changed are the ones of the set  $\cup_{i=1}^t (V_i \setminus X(M_i))$ . Among these vertices, exactly  $|X(M_B)| = 2m_B$  vertices pass from non-covering to covering ones. Suppose that for each of them a cost  $\kappa$  has to be paid. Then, the competitiveness ratio of `Bt_OLVC` can be written (using expression (8)) as

$$c_{\text{Bt\_OLVC}} = \frac{\left(2 \sum_{i=1}^t m_i\right) + 2\kappa m_B}{\left(\sum_{i=1}^t m_i\right) + m_B} \leq 2\kappa \quad (41)$$

and the proof of the theorem is complete. ■

Theorem 8 draws the general case where no further specification of the type of the cost is given. We now assume two cost-models:

- $\kappa$  is a fixed constant;
- $\kappa$  is at most equal to the total number of vertices changed.

For the first cost-model, using expression (41), the following result is directly proved.

**Corollary 5.** *If a fixed cost has to be paid for any vertex-status modification, then the competitiveness ratio of algorithm `Bt_OLVC` against an optimal off-line VC-algorithm is constant.*

Let us now focus ourselves on the second of the cost-models specified above. For this case, we somewhat modify algorithm `Bt_OLVC` as shown just below, and assume  $n$  known in advance.

```

BEGIN *Mt_OLVC*
*arrival of G1*
(1)  C ← X(MAX_MATCHING(G1));
*arrival of Gi, i = 2...t*
(2)  FOR i ← 2 TO t DO
(3)    Mi ← MAX_MATCHING(Gi);
(4)    Pi ← Vi \ X(Mi);
(5)    B ← G[∪j=1iPj];

```

```

(6)      MB ← MAX_MATCHING(B);
(7)      IF mB ≤ √n THEN C ← C ∪ X(Mi);
(8)      ELSE C ← C ∪ Vi;
(9)      FI
(10)     OD
(11)     i0 ← last i for which line (7) is executed;
(12)     B' ← G[∪j=1i0 Pj];
(13)     OUTPUT C ← C ∪ X(MB');
END      *Mt_OLVC*

```

**Theorem 9.** *If for any vertex changed, the cost of the change equals the total number of vertices changed, then the competitiveness ratio of algorithm Mt\_OLVC against an optimal off-line VC-algorithm is bounded above by  $3\sqrt{n}$ .*

**Proof.** Remark first that the only vertex-changes performed by algorithm Mt\_OLVC are on  $X(M_{B'})$  (where  $B'$  is the graph constructed in line (12)) and, furthermore, that  $m_{B'}$  always satisfies

$$m_{B'} \leq \sqrt{n} \quad (42)$$

If line (8) of algorithm Mt\_OLVC is not executed at all, i.e., if  $i_0 = t$  (line (11)), then  $m_{B'} \leq \sqrt{n}$ . Consequently, using expressions (41) and (42):

$$c_{\text{Mt\_OLVC}} \leq 2m_{B'} \leq 2\sqrt{n} \quad (43)$$

On the other hand, suppose that line (8) is executed at least once. Then,

$$m_B > \sqrt{n} \quad (44)$$

Using expression (42), setting  $\kappa = m_{B'}$  and denoting by  $v(C)$  the value of the set  $C$  (in  $v(C)$  any vertex non changed counts 1 and any vertex changed counts  $\kappa$ ), we get:

$$v(C) \leq n - 2m_{B'} + 2\kappa m_{B'} \leq n + 2m_{B'}^2 \quad (45)$$

Denote by  $m$  the cardinality of a maximum matching of  $G$  and use expressions (8), (44) and (45). Then, the following holds for the competitiveness ratio of Mt\_OLVC:

$$c_{\text{Mt\_OLVC}} = \frac{v(C)}{\tau(G)} \leq \frac{n + 2m_{B'}^2}{m} \leq \frac{n}{m_B} + 2m_{B'} \leq 3\sqrt{n} \quad (46)$$

Expressions (43) and (46) conclude then the proof of the theorem. ■

We now show that the result of theorem 9 is quite tight, since no on-line algorithm can achieve competitiveness ratio (against an optimal off-line one) better than  $O(\sqrt{n})$ .

**Theorem 10.** *Under the hypotheses of theorem 9, no on-line algorithm for VC can achieve, against an optimal off-line algorithm, competitiveness ratio  $\sqrt{2n}$ , even if the input-graph is bipartite without isolated vertices and  $n$  is known in advance.*

**Proof.** Let  $(\Delta, n_1) \in \mathbb{N} \times \mathbb{N}$  and set  $n = (1 + \Delta)n_1$ . At the first step,  $V_1$  is an independent set of size  $n_1$ . If player 2 selects some vertices of  $V_1$ , then the whole instance is a graph without any edge. In this case, the optimal value  $\tau^*(G)$  is 0, whereas the on-line value is positive. The resulting ratio equals  $\infty$  and the theorem holds.

Consequently, we can focus ourselves on the case where player 2 selects no vertices during the first step. In this case, the instance graph consists of  $n_1$  stars of size  $(1 + \Delta)$  rooted in  $V_1$ , one star per vertex in  $V_1$ . Then, the optimal value satisfies (recall that  $n = (1 + \Delta)n_1$ )

$$\tau^*(G) = \frac{n}{\Delta + 1} = n_1 \quad (47)$$

Denote by  $V_1'$  the set of vertices of  $V_1$  that are changed in order to be included in the final solution (i.e., the vertices introduced in the solution after the backtracking). Then, solution  $C$  can be written as  $C = V_1' \cup V_2 \setminus \Gamma(V_1')$  for a total cost of

$$v(C) = |V_1'|^2 + \Delta (n_1 - |V_1'|) \quad (48)$$

Consequently, player 2 chooses, at best, a set  $V_1'$  of cardinality

$$\beta^* \in \underset{\lambda \in [0, \frac{n}{\Delta+1}]}{\text{Argmin}} \left\{ \beta^2 - \Delta\beta + \frac{\Delta n}{\Delta + 1} \right\} \quad (49)$$

Define  $\Delta = 2n_1$ . One can easily show that expression (49) implies  $\beta^* = n_1$ , and combination of expressions (47) and (48) with  $\beta^* = n_1$  induces competitiveness ratio satisfying

$$\frac{v(C)}{\tau^*(G)} = n_1 = \frac{-1 + \sqrt{1 + 8n}}{4} \geq \sqrt{2n} \quad (50)$$

where the last inequality in expression (50) holds because function  $\sqrt{\cdot}$  being concave,  $(-1/4) + \sqrt{(1 + 8n)/2} \geq (-1/4) + ((\sqrt{1} + \sqrt{8n})/2) \geq \sqrt{2n}$ . This completes the proof of the theorem. ■

## 6 A simple on-line model based upon edges

We consider in this section an on-line model supposing that the input-graph is revealed by means of its edges. They arrive one at a time. For every new edge, the links of its endpoints with the endpoints of the edges already present are also revealed. We suppose that  $|E|$  is known in advance, we set  $E = \{e_1, \dots, e_{|E|}\}$ , where  $e_i$  are numbered in order of their arrival, and devise the following algorithm.

```

BEGIN *E_OLVC*
  t ← 1;
  C ← X(et);
  FOR t ← 2 TO |E| DO IF X(et) ∩ C = ∅ THEN C ← C ∪ X(et) FI OD
  OUTPUT C;
END. *E_OLVC*
```

As one can see from the algorithm above, the irrevocability in the construction of the on-line solution deals with the endpoints of an edge as a whole. With respect to a model based upon arrival of vertices it is as one allows, for every edge arriving, a backtracking of level one.

**Proposition 2.** *The competitiveness ratio of algorithm E\_OLVC against an optimal off-line algorithm is bounded above by 2. This bound is tight.*

**Proof.** Assume that the IF-instruction of algorithm E\_OLVC is executed  $q$  times. It is easy to see that the  $q$  edges entailing these executions form a maximal matching of  $G$ . The set  $C$  finally

computed by the algorithm verifies  $|C| = 2q$ . On the other hand, by expression (5),  $\tau(G) \geq q$ . The competitiveness bound 2 is then immediately deduced.

Consider a star revealed edge-by-edge. Algorithm `E_OLVC` will introduce in  $C$  the endpoints of the first edge revealed and no new vertex will be introduced in  $C$  later. The optimal vertex-cover for any star consists of its center. So here, the bound 2 is attained. ■

It is easy to see that the on-line model just described is equivalent to the one where all vertices are present from the beginning of the game and edges are presented one-by-one. Here, whenever an edge arrives none of the endpoints of which are in  $C$ , then both of its endpoints enter  $C$ .

## 7 Conclusions

On-line computation is actually a very active area of the theoretical computer science and largely interests the operational researchers from both theoretical and practical points of view, since the mathematical problems here emanate from models expressing reality more richly than the conventional ones. The vertex-covering problem dealt in this paper is one of the central problems in combinatorial optimization in its off-line version. As we have seen at the beginning of the paper, it remains very natural even in its on-line version. There exists a number of open problems that seem interesting for further studies. First of all, the improvement, if possible, of the competitiveness ratios obtained and the achievement of lower bounds for the case where  $t < n$ . Also, a further generalization of the vertex-covering is the one where we consider weights on the vertices of the input-graph and we search for a minimum total-weight vertex cover. In the company model presented in section 1, this generalization has a very natural interpretation if we consider that the manufacturing of an order has its proper cost and the company wishes to minimize the cost of the manufacturing in subcontracting. Perform a sensitive analysis of on-line algorithms for this weighted version of LVC seems to us a very interesting open problem.

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## A Proof of theorem 6

The main idea of the proof is analogous to the one of the proof of item 2 in theorem 2. The extra difficulty here is because of  $t = o(n)$ . It should be noted that the fact  $t = n$  in theorem 2 importantly simplifies the respective proof.

As in section 3.3, we consider a two-player game. Player 1 reveals the instance by clusters while player 2 constructs the solution, i.e., it partitions  $V_i$  into two subsets:  $S_i$  and  $C_i$ , the former one denoting the set of the independent vertices of  $V_i$  and the latter one denoting the set of the covering vertices of  $V_i$ . We denote by **PLAY2** the procedure, representing construction of the decision of player 2, about the partition of  $V_i$ . In other words, the decision of player 2 will be denoted by  $(C_i, S_i) \leftarrow \text{PLAY2}(V_i)$ . Moreover, we call *badly covered* a  $d$ -leaves star whose all leaves are included in the vertex cover under construction. The revealing strategy of player 1 is based upon the following module denoted by **ONE\_VERTEX** and dealing with the revealing of a single vertex. It is called with inputs  $\Delta \in \mathbb{N}$ ,  $G[\cup_{j=1, \dots, i} V_j]$ , i.e., the graph already revealed, and two sets of vertices  $R_S$  and  $R_C$ ; it returns a new vertex  $y$ , its links with the vertices already revealed and the sets  $R_S$  and  $R_C$  updated. The neighbors of  $x$  considered in the third **IF** of algorithm **ONE\_VERTEX** deal with the graph already revealed. For reasons of simplicity, we set in what follows  $G[\cup_{j=1, \dots, i} V_j] = [G]_i$ .

```

BEGIN *ONE_VERTEX*
  IF  $|R_C| = \Delta$  THEN  $y$  is connected to any vertex of  $|R_C|$ ;
    ELSE IF  $|R_S| \neq \emptyset$  THEN choose  $x \in R_S$ ;
       $y$  is linked only with  $x$ ;
      IF  $x$  has  $\Delta$  neighbors THEN  $R_S \leftarrow R_S \setminus x$  FI
    ELSE  $y$  is isolated;
  FI
END *ONE_VERTEX*
```

In the overall revealing algorithm, we use an additional module called **UPDATE**( $X_1, Y_1, X_2, Y_2$ ) and specified in what follows.

```

BEGIN *UPDATE*
  IF  $X_1$  contains an isolated vertex THEN add it in  $X_2$  FI
  IF  $Y_1$  contains an isolated vertex THEN add it in  $Y_2$  FI
END *UPDATE*
```

The final graph  $G$  has a form analogous to the one of figure 1. It consists of:

- $\Delta$  blocks of size  $\Delta + 1$ , the  $\Delta - 1$  first ones being stars and the last one being just a tree and
- a root-vertex such that the whole graph is a tree of degree  $\Delta$

Assume  $\Delta \in \mathbb{N}$ , set  $n = \Delta(\Delta + 1) + 1$  and  $t = \lceil 2\Delta \log \Delta \rceil + (2 + K')(1 + \Delta) + \Delta + 2$ , for  $K' = \lceil 1 + 2 \log \Delta \rceil$ , and consider the following strategy played by player 1 for revealing the graph in  $t$  steps.

```

BEGIN *GAME*
(1)  $K' \leftarrow \lceil 1 + 2 \log \Delta \rceil$ ;
(2)  $K \leftarrow \Delta - 2K' - 3$ ;
(3)  $S \leftarrow \emptyset$ ;
```

```

(4)  C ← ∅;
(5)  i ← 0;
(6)  A ← 0;
*PHASIS 1: main phasis*
(7)  WHILE A < KΔ DO
(8)      i ← i + 1;
(9)      Vi ← independent set of size ⌈K - A/Δ⌉;
(10)     (Ci, Si) ← PLAY2(Vi);
(11)     S ← S ∪ Si;
(12)     C ← C ∪ Ci;
(13)     A ← A + Δ|Si| + |Ci|;
(14)  OD
(15)  r ← A - KΔ;
(16)  RC1 ← a subset of C of cardinality r;
(17)  XS ← S;
(18)  XC ← C \ RC1;
(19)  RS1 ← ∅;
(20)  t ← ⌈2ΔlogΔ⌉ - i;
*PHASIS 2: adjustment of the number t of steps*
(21)  FOR j ← 1 TO t DO
(22)     y ← ONE_VERTEX(Δ, [G]i, RS1, RC1);
(23)     i ← i + 1;
(24)     Vi ← {y};
(25)     (Ci, Si) ← PLAY2(Vi);
        *in this case |Vi| = 1*
(26)     S ← S ∪ Si;
(27)     C ← C ∪ Ci;
(28)     A ← A + Δ|Si| + |Ci|;
(29)     UPDATE(Si, Ci, RS1, RC1)
(30)  OD
*PHASIS 3: adjustment of the congruence of |A| mod Δ with constant number of clusters*
(31)  RC2 ← ∅;
(32)  RS2 ← ∅;
(33)  FOR j ← 1 TO K'(1 + Δ) DO
(34)     IF A ≤ Δ(K + K') THEN s ← 1
(35)         ELSE s ← 2;
(36)         Vi1 ← ∅;
(37)     FI
(38)     FOR k ← s TO 2 DO
(39)         y ← ONE_VERTEX(Δ, [G]i, RSk, RCk);
(40)         Vik ← {y};
(41)     OD
(42)     Vi ← Vi1 ∪ Vi2;
(43)     i ← i + 1;
(44)     (Ci, Si) ← PLAY2(Vi);
        *in this case |Vi| ≤ 2*
(45)     S ← S ∪ Si;
(46)     C ← C ∪ Ci;
(47)     A ← A + |Ci ∩ Vi1|;

```

```

(48)   FOR k ← s TO 2 DO UPDATE( $S_i \cap V_i^k, C_i \cap V_i^k, R_S^k, R_C^k$ ) OD
(49)    $v_3 \leftarrow |R_C^1 \cup R_C^2|$ ;
*PHASIS 4: from  $R_S^1, R_S^2, R_C^1, R_C^2$  to  $R_S, R_C$ *
(50)    $R_S \leftarrow \emptyset$ ;
(51)    $R_C \leftarrow R_C^1 \cup R_C^2$ ;
(52)   FOR j ← 1 TO  $2(\Delta + 1) - v_3$  DO
(53)     i ← i + 1;
(54)     y ← ONE_VERTEX( $\Delta, [G]_i, R_S, R_C$ );
(55)      $V_i \leftarrow \{y\}$ ;
(56)      $(C_i, S_i) \leftarrow \text{PLAY2}(V_i)$ ;
(57)      $S \leftarrow S \cup S_i$ ;
(58)      $C \leftarrow C \cup C_i$ ;
(59)     UPDATE( $S_i, C_i, R_S, R_C$ );
(60)   OD
(61)    $R_S^1 \leftarrow R_S^1 \cup R_S^2$ ;
(62)   WHILE  $R_S^1 \neq \emptyset$  DO
(63)     i ← i + 1;
(64)     y ← ONE_VERTEX( $\Delta, [G]_i, R_S^1, \emptyset$ );
(65)      $V_i \leftarrow \{y\}$ ;
(66)      $(C_i, S_i) \leftarrow \text{PLAY2}(V_i)$ ;
(67)      $C \leftarrow C \cup C_i$ ;
(68)   OD
*PHASIS 5: last block*
(69)   bool ← false;
(70)   j ← 0;
(71)   REPEAT
(72)     y ← ONE_VERTEX( $\Delta, [G]_i, R_S, R_C$ );
(73)     i ← i + 1;
(74)     j ← j + 1;
(75)      $V_i \leftarrow \{y\}$ ;
(76)      $(C_i, S_i) \leftarrow \text{PLAY2}(V_i)$ ;
(77)      $S \leftarrow S \cup S_i$ ;
(78)      $C \leftarrow C \cup C_i$ ;
(79)     UPDATE( $S_i, C_i, R_S, R_C$ )
(80)     bool ← ( $R_S \neq R$ )
(81)     IF  $C_i$  contains an isolated vertex THEN add x in  $R_C$  FI
(82)   UNTIL bool OR j = 1 +  $\Delta$ ;
(83)   IF bool THEN i ← i + 1;
(84)      $V_i \leftarrow \{y\}$  where y is connected to x and to any vertex of  $R_C$ ;
(85)      $(C_i, S_i) \leftarrow \text{PLAY2}(V_i)$ ;
(86)      $C \leftarrow C \cup C_i$ ;
(87)   FI
(88)   FOR k ← 1 TO  $\Delta - j$  DO
(89)     i ← i + 1;
(90)      $V_i \leftarrow \{y\}$  where y is connected only to x;
(91)      $(C_i, S_i) \leftarrow \text{PLAY2}(V_i)$ ;
(92)      $C \leftarrow C \cup C_i$ ;
(93)   OD
*PHASIS 6: completion of G by the last cluster*

```

```

(94)  i ← i + 1;
      *Vi is the set of vertices to be revealed*
(95)  Vi ← ∅;
(96)  for any x ∈ XS, Vi contains Δ vertices connected only to x;
(97)  arbitrarily partition vertices of XC into clusters of Δ vertices;
(98)  for any of the clusters created in line (97) add one vertex in Vi;
(99)  for each vertex v added in line (98)
      link v with the vertices of the corresponding cluster;
(100) for any connected component c of the graph already revealed
      add to G a vertex connected to a vertex of c of degree 1;
(101) (Ci, Si) ← PLAY2(Vi);
(102) S ← S ∪ Si;
(103) C ← C ∪ Ci;
END   *GAME*

```

**Lemma 3.**

1. Lines (7) to (20) (PHASIS 1) of GAME take at most  $\lceil 2\Delta \log \Delta \rceil$  steps. At line (20),  $K\Delta \leq A < (K+1)\Delta$ ,  $r < \Delta$ ,  $|C_1|/\Delta \in \mathbb{N}$  and, moreover,  $|S_1| + |C_1|/\Delta = K$ .
2. At line (30) (end of PHASIS 2),  $i = \lceil 2\Delta \log \Delta \rceil$  and  $A \leq (K' + K)\Delta$ .

**Proof of item 1.** From line (9) one gets  $\Delta|S_i| + |C_i| \leq \Delta|V_i| < (K+1)\Delta - A$ . Hence, the current value of  $A$  satisfies  $A < (K+1)\Delta$ , so  $r < \Delta$ . On the other hand, clearly,  $A = \Delta|S| + |C|$ . Consequently, at the end of the WHILE-loop in line (14), one has  $|S| \leq K$  and, moreover,  $|C| = q\Delta + r$  with  $q + |S| = K$ . So,  $|C_1| = q\Delta$ .

To conclude the proof of item 1, we have to show that the WHILE-loop of line (7) is executed at most  $\lceil 2\Delta \log \Delta \rceil$  times. Denote by  $A_i$  the value of  $A$  at the end of the  $i$ th execution of the loop. Sequence  $(A_i)_i$  satisfies,  $\forall i$ , such that  $A_i < K\Delta$ :

$$A_{i+1} \geq A_i + K - \frac{A_i}{\Delta} \quad (\text{A.1})$$

Let now  $B_i = K\Delta - A_i$ . Sequence  $(B_i)_i$  satisfies (using expression (A.1)) the following induction rule

$$\begin{cases} B_0 = K\Delta \\ B_{i+1} \leq B_i \left(1 - \frac{1}{\Delta}\right) \quad \forall i \text{ such that } B_i > 0 \end{cases} \quad (\text{A.2})$$

From expression (A.2), one can deduce that,  $\forall i$ ,  $B_{i-1} > 0$  and  $B_i \leq K\Delta(1 - \Delta^{-1})^i$ . Furthermore, from expressions (A.1) and (A.2),  $B_i$  becomes non-positive for  $i > \log(K\Delta) / -\log((1 - \Delta^{-1})^i)$ . This last quantity is smaller than  $2\Delta \log \Delta$ . Consequently, the WHILE-loop of line (7) is not executed more than  $\lceil 2\Delta \log \Delta \rceil$  times and the proof of item 1 is complete.

**Proof of item 2.** The value of  $i$  claimed follows immediately from the total number of the iterations of the FOR-loop. At each iteration,  $A$  does not increase by more than 1. Therefore, using item 1,  $A < (K+1)\Delta + \lceil 2\Delta \log \Delta \rceil \leq (K + K')\Delta$  and the proofs of item 2 and of the lemma are complete. ■

From algorithm ONE\_VERTEX we can deduce that at line (30), the graph revealed consists of  $|X_S|$  isolated independent vertices, of  $|X_C|$  (a multiple of  $\Delta$ ) isolated covering vertices, of  $s_2$  badly covered stars of size  $\Delta + 1$ , of  $\sigma_2$  badly covered stars of size  $u_2 + 1$ ,  $u_2 < \Delta$  and of  $v_2$  isolated covering vertices. Moreover,  $\sigma_2 = |R_1^S| \in \{0, 1\}$  and  $v_2 = |R_1^C| \leq \Delta$ .

**Lemma 4.** *At line (49) (end of PHASIS 3),  $i = K'(1 + \Delta) + \lceil 2\Delta \log \Delta \rceil$  and  $A = \Delta(K + K')$ .*

**Proof.** The value of  $i$  immediately follows from the total number of iterations of the FOR-loop (lines (33) to (41)). From algorithm ONE\_VERTEX, if  $s = 1$  from line (31) to (49), then the graph revealed during every loop with  $k = 1$  consists of  $\lambda_1$  badly covered stars of size  $\Delta + 1$ ,  $\sigma'_1 \leq 1$  badly covered stars of size  $1 + u'_1$ ,  $u'_1 < \Delta$  and  $v'_1$  isolated covering vertices. The increasing of  $A$  corresponds to the number of covering vertices added in  $C$  during execution of lines (31) to (49), and this number is equal to  $K'\Delta$ . So,  $A \geq \Delta K + \Delta K'$ . If  $s = 2$  at line (49), we also have  $A = (K + K')\Delta$  and the proof of the lemma is complete. ■

We so have  $A = \Delta(K + K') = |X_S|\Delta + |X_C| + s_2\Delta + \lambda_1\Delta + u'_1 + v'_1 \Rightarrow u'_1 + v'_1 \in \{0, \Delta\}$ . Furthermore, the vertices revealed during every loop with  $k = 2$  induce a subgraph consisting of  $\lambda_2$  badly covered stars of size  $\Delta + 1$ ,  $\sigma'_2 \leq 1$  badly covered stars of size  $1 + u'_2$ ,  $u'_2 < \Delta$  and  $v'_2$  isolated vertices, with  $u'_2 + v'_2 \in \{0, \Delta\}$ . The graph revealed until the end of PHASIS 3 (line (49)), consists of  $|X_S|$  isolated independent vertices, of  $|X_C|\Delta$  isolated covering vertices,  $s_3$  badly-covered stars of size  $\Delta + 1$ , of  $\sigma_3 \leq 1$  badly covered stars of size  $1 + u_3$ ,  $u_3 < \Delta$ , of  $\sigma'_3 \leq 1$  badly covered stars of size  $1 + u'_3$ ,  $u'_3 < \Delta$ , and of  $v_3 \leq 2\Delta$  isolated covering vertices. Furthermore,  $v_3 + u_3 + u'_3 \in \{0, \Delta, 2\Delta\}$  and  $\lambda_1 + \lambda_2 + \sigma'_1 + \sigma'_2 = 2K'$ . Really,  $\sigma'_1 = |R_S^1|$ ,  $\sigma'_2 = |R_S^2|$  and  $v'_1 + v'_2 = |R_C^1 \cup R_C^2| = v_3$ .

**Lemma 5.** *From line (50) to line (68) (PHASIS 4),  $2(\Delta + 1)$  clusters have been revealed. Moreover, at line (68),  $|R_C| < \Delta$ .*

**Proof.** The lemma follows immediately from the fact that if  $v_3 \neq 0$ , then  $v_3 = 2\Delta - v'_1 - v'_2$ . ■

We now describe the graph revealed from line (68) to the end of algorithm GAME (PHASE 5 and PHASE 6). It always contains the  $|X_S|$  isolated independent vertices, the  $|X_C|$  isolated covering vertices; it also contains  $2K' + 2$  or  $2K' + 1$  (depending on whether  $R_C$  is empty or not) badly covered stars of size  $\Delta + 1$ . If  $R_C \neq \emptyset$ , then  $R_S = \{x\}$  and the graph contains one badly covered star, rooted at  $x$ , of size  $1 + \Delta - |R_C|$ . Remark finally that from line (68) to the end of algorithm,  $\Delta + 2$  clusters are revealed. So, the total number of clusters is exactly  $N = \lceil 2\Delta \log \Delta \rceil + (K' + 2)(\Delta + 1) + \Delta + 2 = O(\Delta \log \Delta)$ . From line (69) to line (93) (PHASIS 5), a tree of size  $\Delta + 1$  has been revealed with only one vertex in  $S$  (this vertex is  $x$ ). Then, the completion of  $G$  at lines (94) to line (103) (PHASIS 6) is such that the whole graph contains  $K + 2K' + 2 = \Delta - 1$  badly covered stars of size  $\Delta + 1$ , plus the tree just mentioned, plus one root connected to one vertex in each of the  $\Delta$  connected components revealed. Consequently, the final graph is a tree of maximum degree  $\Delta$  and of order  $\Delta(\Delta + 1) + 1$ ; so  $N = O(\log n \sqrt{n})$ .

The final vertex cover constructed by player 2 has size  $|C| \geq \Delta^2$  ( $|S| \leq \Delta + 1$ ). On the other hand, a minimum vertex cover of the graph is of size  $\Delta + 2$  and the proof of theorem 6 is complete.