# Algorithms for Edge Coloring Bipartite Graphs

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### ALGORITHMS FOR EDGE COLORING

BIPARTITE GRAPHS

~ by

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#### Abstract

A (minimum) edge coloring of a bipartite graph is a partition of the edges into  $\Delta$  matchings, where  $\Delta$  is the maximum degree in the graph. Coloring algorithms are presented that use time  $0(\min(|E|\Delta|\log n,|E|\sqrt{n\log n},n^2\log \Delta))$  and space 0 (n $\Delta$ ). This compares favorably to the previous  $0(|E|\sqrt{n\log \Delta})$  time bound. A coloring algorithm finds a maximum matching on a regular graph. These algorithms compare favorably to the  $0(|E|\sqrt{n})$  matching algorithm, except when  $\frac{\sqrt{n}}{\log n} < \Delta < \sqrt{n}\log n$ .

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#### 1. Introduction

We investigate the problem of finding a minimum edge coloring on a bipartite graph (or multigraph). Here an (edge) coloring is an assignment of a color to each edge of the graph so the colors occurring at any given vertex are distinct; equivalently, each color forms a matching. A minimum coloring uses the fewest number of distinct colors possible.

Many scheduling problems can be formulated in terms of edge coloring. An example is the "class-teacher timetable problem". [Go] Here the bipartite multigraph contains vertices representing classes and teachers; there is an edge joining a class and a teacher for each required meeting of the two. A coloring gives a schedule, i.e., all meetings of a given color occur during the same time slot. A minimum coloring gives a schedule with the fewest number of time slots. In practice such scheduling problems incorporate additional constraints, making them quite difficult. For example, if some teachers are available only during a restricted set of hours, the timetable problem is NP-complete [E]. Other common types of constraints that are difficult to handle are "preassignments" of meetings [Go].

In contrast, the basic problem of finding a minimum edge coloring can be solved efficiently. Let n, |E|, and  $\Delta$  represent the number of vertices, the number of edges, and the maximum degree of any vertex, respectively. (Thus  $\Delta \leq n, |E| \leq n^2$ ). The Konig-Hall theorem [B] leads to an algorithm that finds a minimum coloring by finding  $\Delta$  matchings; the run time is  $O(|E|\Delta\sqrt{n})$ . A second approach derived from classic graph theory uses augmenting paths; the time is O(|E|n) [O]. A previous algorithm based on a divide-and-conquer strategy, uses time  $O(|E|\sqrt{n}\log\Delta)$  and space O(n+|E|) [Ga]. This paper presents several improved coloring algorithms. The first algorithm uses augmenting paths, organized in stages to prevent duplication of effort; it uses  $O(|E|\Delta\log n)$  time. The second algorithm applies the first to the divide-and conquer strategy of [Ga]; it uses  $O(|E|\sqrt{n}\log n)$  time. The third algorithm elaborates on the divide-and-conquer approach, and uses  $O((En\log\Delta)/\Delta)$ , or  $O(n^2\log\Delta)$ , time.

Figure 1 gives an informal comparison of these asymptotic run times, assuming all constant coefficients are 1. It shows that collectively the algorithms are strictly better than [Ga], and each of our three algorithms is best over some interval. The third algorithm has broadest range; it also gives the best estimate in terms of the single parameter  $n, 0 (n^2 \log n)$ .

Our results apply to the problem of finding a maximum cardinality matching on a regular graph. The algorithms find a maximum matching in time  $0(\min(n^2 \log \Delta, n\Delta^2 \log n))(\text{In terms of just n, } 0(n^2 \log n))$ . Except when  $\frac{\sqrt{n}}{\log n} < \Delta < \sqrt{n} \log n$ , this improves the  $0(n\sqrt{n}\Delta)$  bound achieved by the general  $0(|E|\sqrt{n})$  matching algorithm [HK].

#### 2. Preliminaries

This Section introduces terminology and reviews previous coloring algorithms as a basis for the algorithms in Sections 3-4.

Throughout this paper, G denotes a given bipartite graph, and  $\triangle$  denotes its maximum degree. A coloring of G that uses exactly k colors is a k-coloring. Recall these basic facts from graph theory [B].

Fact 1:  $^{\circ}G$  has a matching that covers all vertices of degree  $^{\triangle}$ .

Fact 2: A minimum coloring of G is a  $\Delta$ -coloring.

Fact 1 follows from the well-known Konig-Hall theorem. It justifies line 1 in the following procedure, that finds one color in a coloring. procedure one-color;

### begin

- 1. find a matching M that covers all vertices of maximum degree;
- 2. assign a new color to the edges of M;
- 3. remove the edges of M from the graph; end;

To find a  $\Delta$ -coloring, it suffices to call <u>one-color</u>  $\Delta$  times. This proves Fact 2, and gives the first coloring algorithm.

In procedure <u>one-color</u>, line 1 can be implemented in time  $O(|E|\sqrt{n})$ . The approach is to find two matchings  $M_1, M_2$ : if G has vertex sets  $V_1, V_2$ , (so each edge joins  $V_1$  to  $V_2$ ), matching  $M_i$  covers all maximum degree vertices in  $V_i$ . These matchings are combined to give M, the desired matching, using a construction of Mendelsohn and Dulmage [L]. The time is dominated by finding each  $M_i$ ; this is  $O(|E|\sqrt{n})$  [HK]. With this implementation of one color, a minimum edge coloring is found in time  $O(|E|\sqrt{n} \Delta)$ .

A second well-known algorithm is based on augmenting paths, resembling algorithms for network flows and matchings [L]. We begin with some definitions. Suppose a subset of the edges of G are k-colored, for some  $k \leq \Delta$ . A color  $\alpha$  is missing at vertex x if no edge colored  $\alpha$  is in-

cident to x. An uncolored edge e has  $\underline{type} \ \alpha\beta$  if color  $\alpha$  is missing at one end of e and color  $\beta$  is missing at the other end. (Note an edge may have more than one type.) If e is  $type \alpha\beta$ , an  $\alpha\beta$ (augmenting) path (from e) is a path that starts at one end of e, has edges that alternate between colors  $\alpha$  and  $\beta$ , and has maximal length. (Note the first edge of an  $\alpha\beta$  path may have color  $\alpha$  or  $\beta$ ; we only require that consecutive colors alternate). An  $\alpha\beta$  path starts at a vertex of e; however it never ends at a vertex of e (If it did, G would contain an odd cycle). This justifies the following procedure to color e:

# procedure augment (e);

begin

- 1. let e be of type  $\alpha\beta$ ;
- 2. let P be an  $\alpha\beta$  path from e; comment if  $\alpha = \beta$ , let P be empty;
- 3. interchange colors  $\alpha$  and  $\beta$  on the edges of P; <u>comment</u> now either  $\alpha$  or  $\beta$  is missing at both ends of e;
- 4. color edge e;

end;

(Note the comment in line 3 follows since P does not end at e.)

With the appropriate data structure, path P can be found in line 2 in time proportional to its length, O(n). For example, one possibility is to maintain a vertex-color incidence matrix: for vertex v and color  $\alpha$ , the matrix specifies the edge, if any, incident to v with color  $\alpha$ . Thus augment works in time O(n). Starting with all edges uncolored, we can use augment to color each edge e. This gives an algorithm using time O(|E|n), and space  $O(n\Delta)$ .

A third approach [Ga] uses the method of divide-and-conquer. Recall an <u>euler partition</u> is a partition of the edges of G into open and closed paths, so that each vertex of odd (even) degree is the end of exactly one (zero) open path. Any graph has an euler partition, which can be found in time O(n+|E|)[B,Ga]. This can be used to divide G into two subgraphs,  $G_1$  and  $G_2$ : traverse each path of the partition, placing edges alternately in  $G_1$  and  $G_2$ . It is easy to see  $G_1$  and  $G_2$  both have maximum degree either O(n+|E|)[B,Ga]. This suggests the following coloring algorithm (Note the algorithm is incomplete; insertions will be made at labels A,B,C to complete the algorithm.)

procedure euler-color (G);
begin

- 1. let  $\triangle$  be the maximum degree in G;
- 2. if  $\triangle$  = 1 then color all edges in G, using a new color else begin

  A:
- 3. divide G into subgraphs  $G_1$ ,  $G_2$ , each with maximum degree at most  $\frac{\Delta}{2}$  (use an euler partition);
- 5. euler-color  $(G_2)$ ;
  B:
  end;

Before discussing how to complete this algorithm, we define a useful way to represent a computation of <u>euler-color</u>. The <u>partition tree</u> T for G is a binary tree. Its nodes represent subgraphs passed to <u>euler-color</u> as arguments. The root node represents G. A node representing a subgraph G' with maximum degree at least 2 has 2 sons in T; they represent subgraphs  $G'_1$  and  $G'_2$  of line 3. A node representing a subgraph G' with maximum degree 1 is a leaf in T.

Now consider a node on level i of the partition tree\* representing subgraph  $G_i$ , with edges  $E_i$  and maximum degree  $\Delta_i$ . The following relations are easy to check:

$$(1) \qquad \left\lfloor \frac{|E|}{2^{i}} \right\rfloor \leq |E_{i}| \leq \left\lceil \frac{|E|}{2^{i}} \right\rceil$$

(2) 
$$\left\lfloor \frac{\Delta}{2^{i}} \right\rfloor \leq \Delta_{i} \leq \left\lceil \frac{\Delta}{2^{i}} \right\rceil$$

Further, there are at most  $2^{i}$  nodes on level i; the edges of G are partitioned among the nodes on level i, and T has at most  $\lceil \log \Delta \rceil$  +1 levels.

Now we discuss how to complete <u>euler-color</u>. First suppose the original graph G has maximum degree a power of 2, i.e.,  $\Delta = 2^k$ . Then <u>euler-color</u> finds the desired minimum coloring. This is true because all subgraphs in the partition tree (except leaves) have  $\Delta$  even. Thus in line 3 both  $G_1$  and  $G_2$  have maximum degree  $\Delta/2$ ; the  $\Delta/2$ -colorings of  $G_1$ ,  $G_2$  give a  $\Delta$ -coloring of G. Further, it is easy to see the time required is  $O(|E|\log \Delta)$ , i.e., O(|E|) on each level of the partition tree.

<sup>\*</sup>By convention, a node on level i is at distance i from the root. Thus the root is on level 0, its sons are on level 1, etc.

A difficulty arises whenever  $\Delta$  is odd. In this case subgraphs  $G_1$  and  $G_2$  of line 3 can both have degrees as large as  $\lceil \frac{\Delta}{2} \rceil$ . It is not sufficient to  $\lceil \frac{\Delta}{2} \rceil$  -color each subgraph, since this gives a  $(\Delta+1)$ -coloring of G. Some action must be taken to eliminate the extra color.

The approach of [Ga] eliminates this color <u>before</u> dividing the graph. Thus, at label A, if  $\Delta$  is odd, procedure <u>one-color</u> (given above) is called. It assigns a new color to a matching that covers all maximum degree vertices. Then line 3 only partitions the remaining edges of G, which form a graph with  $\Delta$  even. So the algorithm finds a minimum coloring on any graph. The time is  $O(|E|\sqrt{n}\log\Delta)$ , since in the worst case, <u>one-color</u> is called at each node of the partition tree, using time  $O(|E|\sqrt{n})$  on each level.

Now we present our algorithms. Section 3 gives two algorithms that eliminate the extra color <u>after</u> dividing and coloring the graph, (at label B). Section 4 gives an algorithm that repartitions the graph, at label C, and also eliminates the extra color at B.

### 3. Recoloring Methods

This section presents recoloring methods that, used in procedure <u>euler-color</u> of Section 2, give edge coloring algorithms. The best times for these algorithms are  $O(|E|\Delta \log n)$  and  $O(|E|\sqrt{n \log n})$ .

A recoloring method solves the following problem: Given is (i) a bipartite graph G, with maximum degree  $\Delta$ ; (ii) a partition of G into subgraphs  $G_1, G_2$ , each with maximum degree at most  $\lceil \frac{\Delta}{2} \rceil$ ; (iii)  $\lceil \frac{\Delta}{2} \rceil$  - colorings of  $G_1, G_2$ . The problem is to find a  $\Delta$ -coloring of G. We assume  $\Delta$  is odd (else there is no problem). Thus the colorings of  $G_1, G_2$  give a ( $\Delta$ +1)-coloring of G. To get a  $\Delta$ - coloring, the recoloring method chooses a color, whose edges are denoted by M; these edges are then recolored with the remaining  $\Delta$  colors. A recoloring method that successfully accomplishes this is called <u>valid</u>. If R is a valid recoloring method, we get a correct edge coloring algorithm by inserting in procedure <u>euler-color</u>, at label B, the statement

if  $\Delta$  is odd then R;

The first method simply uses augmenting paths to recolor edges one-by-one.

procedure sequential-recolor;

begin

- 1. let M be the color with the fewest edges;
- 2. for each edge  $e \in M$  do
- augment (e)
  end;

<u>Lemma 1</u>: Procedure <u>sequential-recolor</u> is a valid recoloring method that uses time  $O(|E|n/\Delta)$  and space  $O(n\Delta)$ .

<u>Proof:</u> The method is obviously valid. The time and space bounds follow from those of augment.

Procedure <u>euler-color</u>, with <u>sequential-recolor</u>, gives an edge coloring algorithm that runs in time O(|E|n). To show this, note the time spent on all subgraphs on level i of the partition tree is (by (1)-(2))

$$2^{i}0\left(\begin{array}{c|c} |E|/2^{i} \\ \hline \Delta/2^{i} \end{array}\right) = 0\left(2^{i} \begin{array}{c} |E|n \\ \hline \Delta \end{array}\right).$$

The time spent recoloring edges in levels 0 through k is

(3) 
$$\sum_{i=0}^{k} O(2^{i} |\underline{E}|\underline{n}) = O(2^{k} |\underline{E}|\underline{n}).$$

Taking  $k = \log \Delta$  shows the total recoloring time is O(|E|n). This dominates the run time.

The O(|E|n) bound does not improve known methods. However (3) is a good bound if k<<log  $\Delta$ . We will use this fact to get better bounds.

A source of inefficiency in <u>sequential-recolor</u> is that two  $\alpha\beta$  paths can overlap. Thus an edge can change colors many times. Now we eliminate this inefficiency, by coloring all edges of one type,  $\alpha\beta$ , together.

To do this, define a subgraph  $H_{\alpha\beta}$  containing the edges involved in  $\alpha\beta$  augments: Edge e is in  $H_{\alpha\beta}$  when either

- (i) e is an uncolored αβ edge, or
- (ii) e is on an  $\alpha\beta$  path starting at an uncolored  $\alpha\beta$  edge.

A vertex has degree at most 2 in  $H_{\alpha\beta}$ , so  $H_{\alpha\beta}$  is a disjoint union of paths and cycles. This leads to the following algorithm for coloring all  $\alpha\beta$  edges.

procedure  $TR(\alpha, \beta)$ ; begin

- 1. form subgraph  $H_{\alpha\beta}$ ;
- 2. for each connected component C of  $H_{\alpha\beta}$  do begin
- 3. let  $e_1, \ldots, e_k$  be the sequence of  $\alpha\beta$  edges in C; let  $P_i$  be the  $\alpha\beta$  path joining  $e_i$  to  $e_{i+1}$ ,  $1 \le i < k$ ; let  $P_k$  be the  $\alpha\beta$  path starting at  $e_k$ ,  $P_k \ne P_{k-1}$ ;
- 4. <u>for</u> i := 1 <u>step=2 until</u> k <u>do</u> <u>begin</u>
- 5. interchange colors in  $P_i$ ;
- 6. color  $e_i$  and  $e_{i+1}$  (if  $e_{i+1}$  exists); end end end;

In Figure 2, component C is a cycle. In Figure 2(a), edges  $e_1$  and  $e_2$  are uncolored. Figure 2(b) shows the recolored cycle. In Figure 3(a), C is a path, containing edges  $e_1$ ,  $e_2$ ,  $e_3$ . Note f is an uncolored edge, but not type  $\alpha\beta$ . Figure 3(b) shows the recolored graph.

In the time estimates below, we use this notation:  $c_{\alpha}$  is the number of edges colored  $\alpha$ ;  $u_{\alpha\beta}$  is the number of (uncolored) edges in M of type  $\alpha\beta$ .

<u>Lemma2</u>:  $TR(\alpha,\beta)$  colors all  $\alpha\beta$  edges in M in time  $O(c_{\beta}+u_{\alpha\beta})$  and space  $O(n\Delta)$ .

<u>Proof</u>: First we discuss correctness. TR is clearly correct if C is a path or if C is a cycle with an even number of  $\alpha\beta$  edges. Now we show C is not a cycle with an odd number of  $\alpha\beta$  edges. We do this by contradiction as follows.

Suppose k (in line 3) is odd. After lines 5-6 are executed for  $i=1,3,\ldots,k-2$ , the edges in the sequence  $P_k$ ,  $e_1$ ,  $P_1$ ,...,  $e_{k-1}$ ,  $P_{k-1}$  form an  $\alpha\beta$  path joining the ends of the  $\alpha\beta$  edge  $e_k$ . This gives an odd cycle, the desired contradiction.

For the time bound, first note the time is  $O(|E_{\alpha\beta}|)$ , where  $E_{\alpha\beta}$  is the edge set of  $H_{\alpha\beta}$ . This is clear for lines 2-6. For line 1,

we shall see TR is called with a list of type  $\alpha\beta$  edges available to it. Using this list and the vertex-color incidence matrix, H  $_{\alpha\beta}$  is formed in O(  $|E_{\alpha\beta}|$ ) time.

Now note  $|E_{\alpha\beta}| = 0(c_{\beta} + u_{\alpha\beta})$ . For the number of  $\alpha$  edges in  $H_{\alpha\beta}$  is at most  $c_{\beta} + u_{\alpha\beta}$ . Thus  $|E_{\alpha\beta}| \le 2 (c_{\beta} + u_{\alpha\beta})$ .

The desired time bound now follows. The space is dominated by the vertex-color incidence matrix.  $\Box$ 

Note TR can be appreciably better than <u>sequential-recolor</u>. In Figure 3, suppose <u>sequential-recolor</u> colors edges  $e_3$ ,  $e_2$ ,  $e_1$ , in that order, always choosing an augmenting path that goes clockwise. The edges between  $e_2$  and  $e_3$  are traversed twice, and those between  $e_3$  and f are traversed three times. But in TR, all edges are traversed once. Extending this example to k edges  $e_i$  increases the disparity between the algorithms.

Now we use TR to get a second recoloring method. Note it is not sufficient to apply TR to every color pair  $\alpha\beta$ . Again consider Figure 3. Edge f is type  $\beta\gamma$  in Figure 3(a), and  $\alpha\gamma$  in Figure 3(b). So if  $TR(\alpha,\beta)$  is executed before  $TR(\alpha,\gamma)$ , edge f will not get colored.

The following algorithm handles this problem correctly.

# procedure typed-recolor;

begin

- 1.  $\underline{\text{while}}$  there are uncolored edges in M  $\underline{\text{do}}$  begin
- 2. for each color a do
- 3. for each color  $\beta=\alpha$  do
- 4. <u>if</u> there is an edge of type  $\alpha\beta$  then  $TR(\alpha,\beta)$ ; end end;

<u>Lemma 3</u>: Procedure <u>typed-recolor</u> is a valid recoloring method that uses time  $O(|E|\Delta \log n)$ , and space  $O(n\Delta)$ .

<u>Proof</u>: Correctness of the algorithm is obvious. Now we prove the time bound. First note the algorithm maintains lists of  $\alpha\beta$  edges, for every pair of distinct colors  $\alpha\beta$ . These lists are used by TR(in line 1, to form  $H_{\alpha\beta}$ ). They are also used by <u>typed-recolor</u>, to do the test of line 4 in O(1) time. The lists are initialized when M is chosen, in time  $O(\Delta^2+n)$ . They are updated by TR(in line 6), when an edge f changes type (see discussion above); the updates do not change the time estimate of Lemma 2.

Now we show an execution of the loop in lines 3-4 for a fixed  $\alpha$ , is O(|E|). The time to loop through all colors  $\beta$  is  $O(\Delta)$ . A call  $TR(\alpha,\beta)$  takes time  $O(c_{\beta}+u_{\alpha\beta})$ , where these quantities are calculated <u>immediately</u> before the call (Lemma 2). When  $TR(\alpha,\beta)$  is called, the  $\beta$  edges have not changed since the beginning of the loop (in lines 3-4); thus  $\Sigma c_{\beta} \leq |E|-|M|$ . When  $TR(\alpha,\beta)$  is called there may be new  $\alpha\beta$  edges, created in  $\beta \neq \alpha$  executions of TR (e.g., when  $TR(\alpha,\gamma)$  is called, a  $\beta\gamma$  edge can become  $\alpha\beta$ ). However, it is easy to see  $\Sigma u_{\alpha\beta} \leq |M|$ . Thus the total time in lines 3-4, for a fixed  $\alpha$ , is  $\Sigma O(c_{\beta}+u_{\alpha\beta}) = O(|E|)$ .

It follows that the loop in lines 2-4 is executed once in  $O(|E|\Delta)$  time. So for the desired time bound it suffices to show lines 2-4 are executed at most log n times. To do this, we show each execution of lines 2-4 colors at least half of the edges that are uncolored when the loop begins.

Suppose an uncolored edge e is not colored by the loop. It must be that e changes type, say from  $\beta\gamma$  to  $\alpha\gamma$ , before  $\text{TR}(\beta,\gamma)$  is called but after  $\text{TR}(\alpha,\gamma)$ . The change occurs in  $\text{TR}(\alpha,\beta)$ , when an  $\alpha\beta$  path  $P_k$  gets recolored. Edge e is at the end of  $P_k$ , and so becomes an  $\alpha\gamma$  edge. At the beginning of  $P_k$  is an edge  $e_k$ , that gets colored. Now associate edge  $e_k$  with e. Then every edge that does not get colored is associated with one that does. So at least half the edges get colored.

The space is dominated by the vertex-color incidence matrix. (The lists of  $\alpha\beta$  edges only require  $O(\Delta^2)$  extra space for list heads, and  $\Delta^2 \le n\Delta$ ).  $\square$ 

Now we estimate the time to color a graph using this method.

Theorem 1: Procedure euler-color with typed-recolor finds a minimum coloring in time  $O(|E|\Delta \log n)$ , and space  $O(n\Delta)$ .

<u>Proof</u>: The total time for recoloring graphs on level i of the partition tree is  $O(|E|\Delta|\log n)$ . So the time for all levels greater k is

(4) 
$$\sum_{i = k+1}^{\log \Delta} O(|\underline{E}|\underline{\Delta} \log n) = O(|\underline{E}|\underline{\Delta} \log n)$$

Taking k = -1 gives the desired time bound.  $\square$ 

Since <u>sequential-recolor</u> works well for large  $\Delta$  and <u>typed-recolor</u> works well for small  $\Delta$ , we can combine them to get another efficient algorithm.

#### procedure combined-recolor;

1. 
$$\frac{\text{begin}}{\text{if }} \triangle \ge \sqrt{\frac{n}{\log n}}$$
 then sequential-recolor else typed-recolor end;

Theorem 2: Euler-color with combined-recolor finds a minimum coloring in time  $O(|E|\sqrt{n \log n})$  and space  $O(n\Delta)$ .

Proof: Consider a graph on level i of the partition tree.

If  $i \le \log \left(\Delta \sqrt{\frac{\log n}{n}}\right)$ , the maximum degree is at least  $\left\lfloor \frac{\Delta}{2}i \right\rfloor = \sqrt{\frac{n}{\log n}}$ ; thus <u>sequential-recolor</u> is used. Otherwise, <u>typed-recolor</u> is used. The bound now follows from (3) - (4).  $\Box$ 

### 4. A Repartitioning Method

This Section presents a version of <u>euler-color</u> that uses two partitions of the graph. The run time is  $O(n^2 \log \Delta)$ . This is usually the best of all algorithms presented in this paper.

The main idea is to take advantage of the fact that graphs with maximum degree a power of 2, i.e.,  $\Delta = 2^k$ , are easy to color. As noted in Section 2, the unmodified procedure <u>euler-color</u> works correctly, in time  $O(|E|\log \Delta)$ , on such graphs.

Suppose the graph G, with maximum degree  $\Delta$ , is partitioned into  $G_1$ , i=1,2, each with maximum degree  $\lceil \frac{\Delta}{2} \rceil$ , and  $G_1$  is  $\lceil \frac{\Delta}{2} \rceil$ -colored. Subgraph  $G_2$  can be colored in time  $O(|E|\min(\Delta\log n, \sqrt{n\log n}))$ , using the algorithms of Section 3. However, we can do better, by enlarging  $G_2$ . Suppose we make  $G_2$  a graph with maximum degree a power of 2, by transferring the correct number of colors from  $G_1$  to  $G_2$ . The enlarged  $G_2$  can be colored in time  $O(|E|\log\Delta)$  (faster than the original  $G_2$ ). This coloring, plus the coloring of the remainder of  $G_1$ , can be combined to get a coloring of  $G_2$ . This gives the following algorithm.

# procedure binary-color (G);

### begin

- 1. let  $\triangle$  be the maximum degree in G;
- 2. <u>if  $\Delta = 1$  then</u> color all edges in G, using a new color <u>else begin</u>

3. divide G into subgraphs  $G_1$  and  $G_2$ , each with maximum degree at most  $\lceil \frac{\Delta}{2} \rceil$ , where  $G_1$  has no more edges than  $G_2$  (use an euler partition);

4. / binary-color  $(G_1)$ ;

5. C: transfer the edges of  $2^{i} - \left[\frac{\Delta}{2}\right]$  colors from  $G_{1}$  to  $G_{2}$ , where  $i = \left[\log \frac{\Delta}{2}\right]$ ;

6. binary-color  $(G_2)$ ;

7. B: if  $\triangle$  is odd then sequential-recolor; end end;

Labels B and C show the relationship of this algorithm to euler-color.

Figure 4 illustrates <u>binary-color</u>. It shows the "spine" of the partition tree for a graph G with maximum degree 13. Line 3 divides G into subgraphs  $G_1$ ,  $G_2$ , with maximum degree 7.  $G_1$  is represented by the left son of the root. In line 4, recursive calls to <u>binary-color</u> divide G into subgraphs of degree 4, etc. Eventually  $G_1$  is 7-colored. Then line 5 transfers one color from  $G_1$  to  $G_2$ . The maximum degree of  $G_1$  becomes 6, while that of  $G_2$  becomes 8 (a power of 2). Line 6 8-colors  $G_2$ . This gives a 14-coloring of G. Finally line 7 finds a 13-coloring.

Theorem 3: Procedure binary-color finds a minimum edge coloring in time  $O(|E|n \log \Delta)/\Delta) = O(n^2 \log \Delta)$  and space  $O(n\Delta)$ .

<u>Proof:</u> First we discuss the correctness of the algorithm. We begin by noting the transfer in line 5 can always be done. For subgraph  $G_2$  has maximum degree at least  $\left\lfloor \frac{\Delta}{2} \right\rfloor$ , and

$$\left\lfloor \frac{\Delta}{2} \right\rfloor = \Delta - \left\lceil \frac{\Delta}{2} \right\rceil = 2^{\left(\log \frac{\Delta}{2}\right) + 1} - \left\lceil \frac{\Delta}{2} \right\rceil > 2^{\left\lceil \log \frac{\Delta}{2} \right\rceil} - \left\lceil \frac{\Delta}{2} \right\rceil.$$

Thus  ${\rm G_2}$  contains a sufficient number of colors to transfer.

Now we check binary-color finds a  $\Delta$ - coloring. Let  $\Delta_i$  be the maximum degree of subgraph  $G_i$ , i = 1,2. Although the transfer in line 5 changes  $\Delta_i$ , the quantity  $\Delta_i$  +  $\Delta_2$  stays the same. So if  $\Delta$  is even, the coloring of G after line 6 is minimum. If  $\Delta$  is odd, this coloring uses one extra color, which is eliminated in line 7. So in either case, binary-color finds a  $\Delta$ - coloring.

For the time bound, we refer to the spine of the partition tree illustrated in Figure 4. (Define the spine as follows: The root represents the original graph. A node representing a  ${\rm G_1}$  subgraph is a left son, and a  ${\rm G_2}$  subgraph is a right son. All descendents (in the partition tree) of  ${\rm G_2}$  subgraphs are omitted from the spine.) Now we break the time up into two parts: that spent in the  ${\rm G_1}$  subgraphs, and that spent in the  ${\rm G_2}$  subgraphs, in the spine.

Consider a  $G_1$  subgraph on level i. We estimate the time spent in all lines of <u>binary-color</u>, excluding the recursive calls. Let  $\Delta_i$  and  $E_i$  represent the maximum degree and the edge set of  $G_1$ , respectively. It is easy to see lines 1-3 and 5 are  $O(|E_i|)$ , while line 7 is  $O(|E_i|n/\Delta_i)$ , by Lemma 1. Since  $n>\Delta_i$ , line 7 dominates. Using (1)-(2), we see line 7 is  $O((|E|n/\Delta))$ . Summing over all  $\log \Delta$  levels of the partition tree gives a total time of  $O((|E|n\log\Delta)/\Delta)$ .

Now consider a  $G_2$  subgraph on level i. We estimate the time spent by <u>binary-color</u> to color the enlarged graph, with maximum degree a power of 2. Let  $\Delta_i$  and  $E_i$  represent the maximum degree and the edge set of  $G_2$ , before it is enlarged. Then after enlarging, the maximum degree is at most  $2\Delta_i$ , and the number of edges is at most  $2|E_i|$  (see line 3). In general, the time for <u>binary-color</u> to color a graph with  $\Delta$  a power of 2 and edges E is  $O(|E|\log\Delta)$  (Lines 5 and 7 do nothing, so the algorithm works identically to those in Section 3) So using (1)-(2) of Section 2, the time to color all  $G_2$  subgraphs is

$$\int_{1}^{\log \Delta} \sum_{i=0}^{\infty} O(\left\lceil \frac{|E|}{2^{i}} \right\rceil \log \left\lceil \frac{\Delta}{2^{i}} \right\rceil) = O(|E| \log \Delta).$$

Adding the times for the  $\mathbf{G}_1$  and  $\mathbf{G}_2$  subgraphs gives the desired bound.

The space is dominated by the vertex-color incidence matrix.  $\Box$ 

# 5. Application to Matching

In a regular graph, each color of a minimum edge coloring is a maximum matching. So any coloring algorithm finds a maximum matching. This gives the following result.

<u>Lemma 4</u>: If G is regular, a maximum matching can be found in time  $O(\min(n\Delta^2 \log n, n\Delta \sqrt{n \log n}, n^2 \log \Delta))$  and space  $O(n\Delta)$ .

When G is regular and  $\Delta$  is a power of 2, <u>euler-color</u> can be simplified to find a maximum matching in time linear in the number of edges,  $O(n\Delta)$ , [Ga]. When  $\Delta$  is close to a power of 2, we can also improve the above bounds:

<u>Lemma 5</u>: If G is regular and  $\Delta = 2^k \pm c$ , where c is constant, a maximum matching can be found in time  $O(n^2 + |E| \log \Delta)$  and space  $O(n\Delta)$ .

<u>Proof</u>: If  $\Delta=2^{k}+c$ , proceed as follows: First form a subgraph H with  $\Delta \leq 2^{k}$ , by removing c or more edges from each vertex. Then use <u>euler-color</u> to  $2^{k}$  color H. Finally use <u>sequential-recolor</u> for the edges in G-H. The time is  $O(|E|\log \Delta)$  for <u>euler-color</u>, and  $O(n^{2})$  to sequential-recolor at most cn edges.

If  $\Delta=2$   $^k$ c, proceed similarly: First  $2^k$ color G; then sequential-color the extra c colors.

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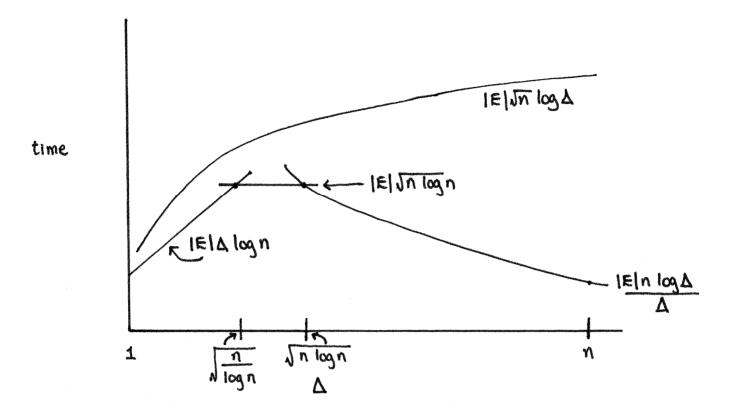


Fig. 1 Asymptotic times of coloring algorithms

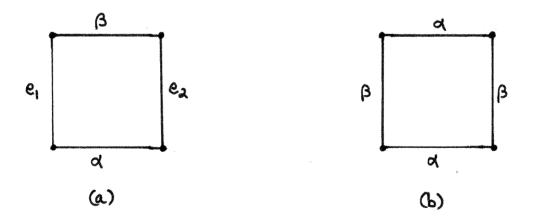


Fig. 2 First recoloring example

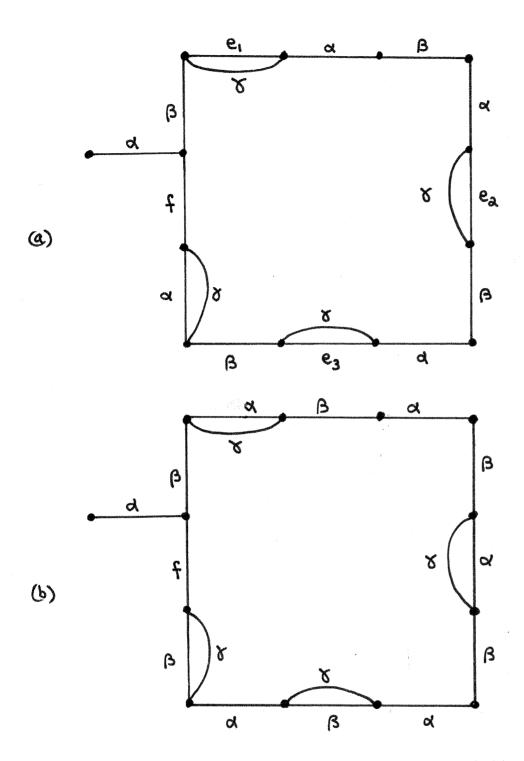


Fig. 3 Second recoloring example

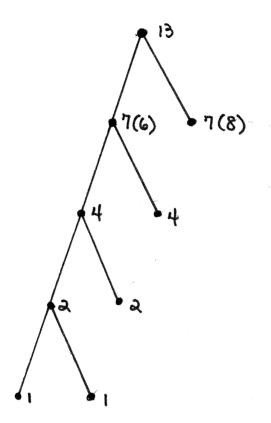


Fig. 4 Partition tree spine