

# Efficient Parallel Modular Decomposition (Extended Abstract)

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**Abstract.** Modular decomposition plays an important role in the recognition of comparability graphs and permutation graphs [12]. We prove that modular decomposition can be done in in polylogarithmic time with a linear processor bound.

**Keywords.** Parallel algorithms, graph theory, graph algorithms

## 1 Introduction

By a *module* of a graph  $G = (V, E)$ , we define a subset  $V'$  of the vertex set  $V$  such that all vertices in  $V'$  have the same neighbors outside  $V'$ . The decomposition of a graph into modules has many applications. First, modular decomposition allows a more compact representation of a graph. Modular decomposition plays also an important role in the recognition of certain graph classes like interval graphs, comparability graphs, and permutation graphs (see for example [12]). One only has to check that the 'module components' are permutation, interval, or comparability graphs respectively. Modular decomposition is also helpful to solve classical graph problems like graph coloring or maximum clique. The best known sequential algorithms for modular decomposition have a time bound of  $O(n + m)$  [9, 4]. The only problem of these optimal algorithms is that a big mathematical effort is necessary to understand them. Previous efficient (not linear time) algorithms are due to [10] and [14]. Parallel algorithms with a non linear processor bound are due to M. Morvan and L. Viennot and to M. Novick (both unpublished).

Very related to the problem of modular decomposition is the problem to recognize cographs [3]. In some sense, cographs are those graphs which are totally decomposable into modules, i.e. each induced subgraph with at least four vertices has a module of size at least two.

The goal of this paper is to develop a parallel algorithm for modular decomposition. The processor number is linear, and the time is polylogarithmic. Compared to the algorithms of [9, 4], the algorithm presented here is quite simple. We combine some ideas of the parallel cograph recognition algorithm of [5] and the sequential divide and conquer modular decomposition method of [6].

As in [5], we distinguish between low degree, middle degree, and high degree vertices. In case of the existence of a middle degree vertex, we consider its neighbors, non neighbors, do modular decompositions separately, and combine the modular decomposition to a big one. If there are only low degree vertices then we compute a spanning tree and compute a first approximation of an elimination ordering as done by P. Klein [8]. Up to modules containing the root of the spanning tree, all modules appear only in one level. We make a modular decomposition in each level and combine these. In case that all vertices have high degree we only have to consider the complement.

The only situation that is left is that we have low degree vertices and high degree vertices but no middle degree vertices. There we distinguish between small size and large size modules. We shall find out that first contain only low degree vertices or only high degree vertices. Large size modules have the property that the neighborhood consists only of large degree vertices and the non neighborhood consists only of low degree vertices.

Section 2 introduces the notations and basic notions that are of relevance in the whole paper. Section 3 discusses describes the algorithm. Section 4 presents a complexity analysis of the algorithm.

## 2 Notation

A graph  $G = (V, E)$  consists of a *vertex set*  $V$  and an *edge set*  $E$ . Multiple edges and loops are not allowed. The edge joining  $x$  and  $y$  is denoted by  $xy$ .

We say that  $x$  is a *neighbor* of  $y$  iff  $xy \in E$ . The *neighborhood* of  $x$  is the set  $\{y : xy \in E\}$  consisting of all neighbors of  $x$  and is denoted by  $N(x)$ . The neighborhood of a set of vertices  $V'$  is the set  $N(V') = \{y | \exists x \in V', xy \in E\}$  of all neighbors of some vertex in  $V'$ .

A *subgraph* of  $(V, E)$  is a graph  $(V', E')$  such that  $V' \subset V$ ,  $E' \subset E$ . An *induced subgraph* is an edge-preserving subgraph, i.e.  $(V', E')$  is an induced subgraph of  $(V, E)$  iff  $V' \subset V$  and  $E' = \{xy \in E : x, y \in V'\}$ .

By a *module* of  $G = (V, E)$ , we mean a subset  $V'$  of  $V$  such that with  $y \in V \setminus V'$  and  $u, v \in V'$ , both  $uy$  and  $vy$  are in  $E$  or none of  $uy$  and  $vy$  is in  $E$ .

We compute not all modules but those modules  $X$  which do not *overlap* with other modules, i.e. there is no module  $Y$  that has a nonempty intersection with  $X$  and neither  $X \subset Y$  nor  $Y \subset X$ . We call such modules also *overlap free*. Note that the overlap-free modules of any graph form a tree with respect to set inclusion, i.e. two overlap free modules are disjoint or comparable with respect to set inclusion. The notions of parent and child modules can be defined in an obvious way. The parent  $P(X)$  of an overlap-free module  $X$  is the unique smallest overlap free module that is a proper superset of  $X$ .  $Y$  is a child module of  $X$  if and only if  $Y$  is an inclusion maximal proper overlap free submodule of  $X$ . The algorithm we present later computes, for a given graph  $G$ , a root directed tree  $T_G$  representing the overlap free modules in their tree like ordering with respect to set inclusion.

There are the following types of overlap free modules:

**Prime Modules** First define a graph  $G = (V, E)$  with more than two vertices as *prime* if all the only modules are  $V$  and the subsets of  $V$  containing exactly one vertex. An overlap free module  $X \subseteq V$  is called *prime* if the graph that results from  $G[X]$  after identification of all vertices in the same child module of  $X$  is prime.

**Degenerated Modules** An overlap free module  $X$  is *degenerated* if the graph that results from  $G[X]$  after identification of all vertices appearing in the same child module is complete or forms an independent set.  $X$  is called *positively degenerated* or also called a 1-module if the resulting graph is complete, i.e. all vertices are pairwise adjacent. Otherwise, if the resulting graph forms an independent set, the degenerated submodule  $X$  is called *negatively degenerated module* or a 0-module.

Note that any module, overlap free or not, is a prime module or a subset of a degenerated module  $X$  with the property that each child module is a subset of  $X$  or disjoint with  $X$  (compare [9]).

The goal of this algorithm is, given a graph  $(V, E)$ , to compute a rooted tree  $T_G$  such that the leaves are the vertices of  $G$  and each inner node  $t$  represents an overlap free module, i.e. the leaves that are descendants of  $t$  form an overlap free module of  $G$ . We call this tree  $T_G$  also the *modular tree* of  $G$ .

The computation model is the CRCW-PRAM. We measure each primitive operation by one time unit.

### 3 The Algorithm

The algorithm is a divide and conquer strategy. We reduce the problem to subgraphs with at most  $3/4|V|$  vertices to get a logarithmic recursion depth. We distinguish between vertices of low degree, middle degree, and high degree. A vertex  $v$  of  $G = (V, E)$  is of *low degree* if it is of degree at most  $1/4|V|$ . If the degree is at least  $3/4|V|$  then the vertex is called a *high degree* vertex. If a vertex is neither a high degree nor a low degree vertex then it is called a *middle degree* vertex.

#### 3.1 First Case: There is a Middle Degree Vertex

Suppose there is a middle degree vertex  $u$ . Clearly each module  $X$  that does not contain  $u$  has the property that all vertices of  $X$  are in the neighborhood of  $u$  or none of them. Therefore every module not containing  $u$  is a prime module of the neighborhood or the non neighborhood of  $u$  or a subset of a degenerate module of the neighborhood or of the non neighborhood of  $u$ .

We first find out the modules that do not contain  $u$ . Let  $L_1$  be the set of neighbors of  $u$  and  $L_2$  be the set of non neighbors of  $u$ . Note that each module that does not contain  $u$  is a subset of  $L_1$  or a subset of  $L_2$ . Moreover, each module in  $L_1$  or  $L_2$  has the property that all vertices have the same vertices outside  $L_1$  or  $L_2$  respectively. A prime module of the whole graph that is in

$L_1$  or  $L_2$  is also a prime module of  $G$  restricted to  $L_1$  or  $L_2$  respectively. A degenerated module of the whole graph that appears as a subset of  $L_1$  or  $L_2$  is a subset of a degenerated module of  $G$  restricted to  $L_1$  or  $L_2$  respectively (not necessarily the whole degenerated module).

We assume that modular trees  $T_1$  and  $T_2$  of  $G$  restricted to  $L_1$  and  $G$  restricted to  $L_2$  respectively are computed recursively.

*We first find out those overlap-free modules of  $G$  restricted to  $L_1$  and  $L_2$  that remain modules of the whole graph.* We call a module of  $L_1$  or  $L_2$  *inhomogeneous* if it has descendants in the modular tree with different neighborhoods outside  $L_1$  or  $L_2$  respectively. We find out inhomogeneous modules, i.e. the tree nodes that represent inhomogeneous modules as follows. We assume that the trees  $T_1$  and  $T_2$  are embedded into the plane and the leaves of  $T_1$  and  $T_2$ , i.e. the vertices of  $L_1$  and  $L_2$  are enumerated from left to right, say  $L_1 = \{x_1, \dots, x_k\}$  and  $L_2 = \{y_1, \dots, y_l\}$ . Such enumerations can be computed in  $O(\log n)$  time with  $O(n/\log n)$  processors using Eulerian cycle techniques on trees (see for example [15, 2]). We assign those  $(x_i, x_{i+1})$  and  $(y_i, y_{i+1})$  that distinguish in the neighborhood in  $L_2$  and  $L_1$  respectively. We determine the least common ancestors  $s_i$  and  $t_i$  of all assigned pairs  $(x_i, x_{i+1})$  and  $(y_i, y_{i+1})$  in  $O(\log n)$  time with  $O(n/\log n)$  processors [11]. We assign all tree nodes as inhomogeneous that are ancestors of at least one assigned tree node  $s_i$  or  $t_i$  in  $O(\log n)$  time with  $O(n/\log n)$  processors [15].

*The second step is to find out new degenerate modules,* i.e. homogeneous subsets of inhomogeneous degenerated modules of  $L_1$  and of  $L_2$ . We consider vertices of  $L_1$  or  $L_2$  as *equivalent* if they have the same neighbors outside  $L_1$  or  $L_2$  respectively. One can find the equivalence classes by lexicographic sorting in  $O(\log n)$  time using  $O(n + m)$  processors (to compare the neighborhoods of two vertices with degrees  $d_1$  and  $d_2$ , one needs  $d_1 + d_2$  processors and constant time on a CRCW-PRAM. To sort  $n$  elements, one needs  $O(n)$  processors and  $O(\log n)$  time [1]). Let  $A$  be an equivalence class and  $X$  be an inhomogeneous degenerated module and  $X_1, \dots, X_k$  be the child modules of  $X$  that are subsets of  $A$ . If  $X$  contains more than one such child module in  $A$  then we create a new module  $X_A$  with  $X_1, \dots, X_k$  as its children, i.e. suppose  $t$  has been assigned as inhomogeneous and represents a degenerate module. Suppose  $t$  has more than one child that are not assigned as inhomogeneous. For each non inhomogeneous child  $t'$  of  $t$ , we pick a vertex  $v_{t'}$  of  $G$  that is a descendent of  $t'$  ( $v_{t'}$  is a leaf). This can be done in  $O(\log n)$  time with  $O(n/\log n)$  processors by list ranking along the Eulerian cycle along the double edged tree. Consider children  $t'$  and  $t''$  of  $t$  as equivalent if  $v_{t'}$  and  $v_{t''}$  are equivalent. We determine the equivalence classes by sorting (in  $O(\log n)$  time with  $O(n)$  processors for all  $t$  simultaneously). For each equivalence class  $A$ , we create a new node with the children of  $t$  in  $A$  as children.

*It remains to find out the modules that contain  $u$ .* Let  $X$  be a module containing  $u$ . Note that every neighbor of  $X$  that is not in  $X$  is in the neighborhood of  $u$ . Let  $L_1$  be the set of neighbors of  $u$  and  $L_2$  be the set of non neighbors of  $u$ . Since all neighbors of  $X$  not being in  $X$  are in  $L_1$ ,  $X \cap L_2$  is a union of connected

components of  $G$  restricted to  $L_2$ . Note that each module of  $G$  is also a module of the complement of  $G$ . Therefore for symmetry reasons,  $X \cap L_1$  is the union of connected components of the complement of  $G$  restricted to  $L_2$ .

Shortly we call connected components of  $G$  restricted to  $L_2$  *2-components* and connected components of the complement of  $G$  restricted to  $L_1$  *1-components*. Note that all 1-components and 2-components are known recursively as modules of  $G$  restricted to  $L_1$  and  $L_2$  respectively.

We consider the situation that  $D_1$  is a 2-component not in the module  $X$  and  $D_2$  is a 2-component in  $X$ . Let  $C_1$  be a 1-component, such that there is an edge joining some vertex in  $x \in D_1$  with some vertex  $y \in C_1$ . Then also  $C_1$  is not in  $X$ . Since  $C_1$  is a subset of the neighborhood of  $u$ , and therefore in the neighborhood of  $X$ , all vertices in  $X$  are adjacent to all vertices in  $C_1$ . Therefore also all vertices in  $D_2$  are adjacent to all vertices in  $C_1$ .

A 1-component  $C$  is called *strongly adjacent* to a 2-component  $D$  if each vertex of  $C$  is joined by an edge with each vertex of  $D$ . We call  $C$  also a *strong neighbor* of  $C$  and vice versa. A 1-component  $C$  is called *weakly adjacent* to a 2-component  $D$  if there is an edge joining some vertex of  $C$  with some vertex of  $D$ . We call  $D$  also a *weak neighbor* of  $C$  and vice versa.

We can reformulate above observation as follows.

*Let  $X$  be a module containing  $u$ ,  $D_1$  be a 2-component not in  $X$ , and  $D_2$  be a 2-component in  $X$ . Then all weak neighbors of  $D_1$  are strong neighbors of  $D_2$ .*

Next observe that any 1-component  $C$  with the property that some 2-component in  $X$  is not a strong neighbor of  $C$  must be in  $X$  and any 1-component that is a weak neighbor of some 2-component not in  $X$  must not be in  $X$ .

**Theorem 1.** *Let  $u \in X \subseteq V$ .*

*Then  $X$  is a module if and only if*

1. *For all 1- and 2-components  $D$ ,  $D \subseteq X$  or  $D \cap X = \emptyset$*
2. *For all 2-components  $D_1 \not\subseteq X$ ,  $D_2 \subseteq X$ , all weak neighbors of  $D_1$  are strong neighbors of  $D_2$ ,*
3. *all 1-components not in  $X$  are strong neighbors of all 2-components in  $X$ , and*
4. *all 1-components being weak neighbors of some 2-component not in  $X$  are not in  $X$ .*

*Proof.* The second statement follows from the first by previous discussions.

Suppose now, the second condition is satisfied. First we show that all neighbors of  $X$  not in  $X$  are in  $L_1$ . Since  $L_1 \cap X$  is a union of connected components of  $G$  restricted to  $L_2$ , no edge appears between a vertex of  $L_2 \cap X$  and a vertex of  $L_2 \setminus X$ . Since all 1-components being weak neighbors of some 2-component not in  $X$  are not in  $X$ , there is also no edge between a vertex in  $L_2 \setminus X$  and a vertex in  $L_1 \cap X$ . Therefore no neighbor of  $X$  in  $L_2$  exists.

Since every connected component of the complement of  $G$  restricted to  $L_1$  is either completely in  $X$  or disjoint with  $X$ , every vertex in  $X \cap L_1$  has all vertices in  $L_1 \setminus X$  as a neighbors. Therefore all vertices in  $X \cap L_1$  have all the same neighbors outside  $X$ .

Since all 1-components not in  $X$  are strong neighbors of all 2-components in  $X$ ,  $L_1 \setminus X$  is also the neighborhood outside  $X$  of every vertex in  $L_2 \cap X$ . Q.E.D.

We continue with some remarks on the structure of positively and negatively degenerated modules containing  $u$ .

*First we consider the case that  $X$  is a negatively degenerated overlap free module.* Let  $Y$  be the child module of  $X$  containing  $u$ . Then all child modules  $Y' \neq Y$  of  $X$  are 2-components. The weak neighborhood of any such  $Y' \neq Y$  is also its strong neighborhood, and all these child modules  $Y' \neq Y$  of  $X$  have the same 1-components as weak and strong neighbors. Since  $X$  is a negatively degenerated module, there is no edge joining any vertex in a child module  $Y' \neq Y$  with some vertex in  $X \setminus Y'$ . Therefore these 1-components are not in  $X$  and therefore not in  $Y$ .

Note that  $Y$  is not a negatively degenerated module and therefore connected. Therefore each 2-component in  $Y$  has at least one 1-component in  $Y$  as a neighbor and the number of weak neighbors of any 2-component in  $Y$  is larger than the number of weak neighbors of any child module  $Y' \neq Y$  of  $X$ .

Now let  $D'$  be any 2-component not in  $X$ . Note that every weak neighbor of  $D'$  is a strong neighbor of any 2-component  $D$  in  $X$ . This is particularly true for the child modules  $Y' \neq Y$  of  $X$ . Therefore  $D'$  has at most as many weak neighbors as any child module  $Y' \neq Y$  of  $X$ . We assume that the number of weak neighbors of  $D$  and of  $Y'$  is equal. Then  $Y'$  and  $D$  have the same weak neighbors, because the weak neighborhood of  $D'$  is a subset of the strong neighborhood of  $Y'$ . The strong neighborhood of  $D'$  must be a proper subset of the strong neighborhood of  $Y'$  (which is also the weak neighborhood of  $Y'$ ). Otherwise  $D' \cup X \setminus Y$  and  $X$  are overlapping modules. This is a contradiction.

Negatively degenerated overlap free modules  $X$  with  $Y$  as child module containing  $u$  have therefore the following characteristic structure.

1. All 2-components in  $X \setminus Y$  have the same 1-components as weak neighbors.
2. the 2-components in  $X \setminus Y$  are the child modules of  $X$  that are not identical to  $Y$ ,
3. the weak neighbors of any 2-component in  $X \setminus Y$  are also strong neighbors,
4. the weak (and therefore strong) neighbors of any 2-component in  $X \setminus Y$  are all not in  $X$
5. the weak (and therefore strong) neighborhood of any 2-component in  $X \setminus Y$  is a proper subset of the weak neighborhood of any 2-component in  $Y$
6. for any 2-component  $D'$  not in  $X$  and any 2-component  $D$  in  $X \setminus Y$ , the weak neighborhood of  $D'$  is a subset of the weak (and therefore strong) neighborhood of  $D$  and the strong neighborhood of  $D'$  is a proper subset of the strong neighborhood of  $D$ .

*Now let  $X$  be a positively degenerated overlap free module and  $Y$  be the child module of  $X$  containing  $u$ .*

Note that all child modules  $Y' \neq Y$  of  $X$  are 1-components. All these child modules  $Y' \neq Y$  are strong neighbors of each 2-component in  $X$  and have no

2-components not in  $X$  as weak neighbors. Moreover, each 1-component  $C$  in  $Y$  is a non strong neighbor (not even necessarily a weak neighbor) of some 2-component in  $X$ . Otherwise  $(X \setminus Y) \cup C$  and  $X$  would be overlapping module (contradiction). Observe that each 1-component  $C$  with no 2-component outside  $X$  as weak neighbor and all 2-components in  $X$  as strong neighbors is a child module of  $X$ . Otherwise  $X$  and  $(X \cup C) \setminus Y$  would be overlapping modules (contradiction).

Therefore positively degenerated overlap free modules can be characterized as follows.

1.  $Y$  and  $X$  have the same 2-components
2. each 1-component in  $Y$  is a non strong neighbor of some 2-component in  $Y$ ,
3. the 1-components in  $X \setminus Y$  are the child modules of  $X$  not identical to  $Y$ ,
4. all 1-components  $X \setminus Y$  are strong neighbors of any 2-component in  $X$  and not weak neighbors of any 2-component not in  $X$ ,
5. each 1-component not in  $X$  is a weak neighbor of some 2-component not in  $X$ .

We assume that the modules of  $G$  restricted to  $L_1$  and  $G$  restricted to  $L_2$  are known. Then we also know the 1-components (as positively degenerated modules of  $L_1$  that are maximal submodules of  $L_1$ ) and the 2-components (as negatively degenerated modules of  $L_2$  that are maximal submodules of  $L_2$ ).

We get the overlap free modules containing  $u$  in several steps. We first sort the 2-components with respect to the number of weak and strong neighbors and we determine the final segments of the sorted sequence "representing" modules, and finally we determine the modular tree.

In detail we proceed as follows.

1. We sort all 2-components with respect to the number of weak neighbors to a sequence  $(D_1, \dots, D_l)$ . If the number of weak neighbors of two 2-components is equal then the 2-component with the larger number of strong neighbors is considered as the larger 2-component. This can be done in  $O(\log n)$  time with  $O(n + m)$  processors (we compute, for each 2-component, the number of its weak and strong neighbors in  $O(\log n)$  time with  $O(n + m)/\log n$  processors and sort in  $O(\log n)$  time with  $O(n)$  processors [1]).
2. For each 1-component  $C$ , we determine the minimum index  $i = \text{Max}(C)$  such that for all  $j > i$ ,  $D_j$  is a strong neighbor of  $C$ , (i.e. the maximum index of a 2-component that is not a strong neighbor of  $C$ ) and the minimum  $j = \text{Min}(C)$  such that  $D_j$  is a weak neighbor of  $C$ . This can be done, for all  $C$  simultaneously, in  $O(\log n)$  time with  $O(n + m)/\log n$  processors (standard minimum computation).
3. Let  $I_i := \bigcup_{j \geq i} D_j$ . We determine all  $I_i$  with the property that there is a module  $M_i$  with  $I_i = M_i \cap L_2$ . In that case, we say that  $i$  represents a module. Note that  $i$  represents a module iff there is no interval  $[\text{Min}(C), \text{Max}(C)]$  with  $\text{Min}(C) < i$  and  $\text{Max}(C) \geq i$ . We check whether  $i$  represents a module as follows. For each  $j$ , we determine the maximum  $j' = m(j)$ , such that there

is a  $C$  with  $Min(C) = j$  and  $Max(C) = j'$ . Let  $ma(i)$  be the maximum  $Max(C)$  with  $Min(C) < i$ . Then  $i$  represents a module iff  $ma(i) < i$ . Note that  $ma(i) = \max_{j < i} m(j)$ .  $m(j)$  can be computed in  $O(\log n)$  time with  $O(n + m)/\log n$  processors (standard minimum computation).  $ma(i)$  can be computed in  $O(\log n)$  time with  $O(n/\log n)$  processors using parallel prefix computation.

4. We determine the negatively degenerated modules as follows. We compute the sets of maximal intervals  $I$  such that
  - each  $i \in I$  represents a module and
  - all  $D_i$  with  $i \in I$  have only strong neighbors as weak neighbors and the same strong neighbors. It is sufficient to check that the number of strong and weak neighbors coincide and that numbers of strong neighbors are equal.
  - $k_I = \max I + 1$  represents a module (this has to be tested only in case that  $I$  has only one element).

If these conditions are satisfied then we say that  $I$  represents a negatively degenerate module.

The negatively degenerated module module  $X_I$  represented by  $I$  consists of all  $D_i$ ,  $i \in I$  and

$$\bigcup_{j \geq k_I} D_j \cup \{u\}$$

$$\{x \in L_1 | x \text{ is in the neighborhood of some } D_j, j \geq k_I$$

$$\text{and not in the neighborhood of some } D_j, j < k_I\}$$

as submodules.

To find out such intervals  $I$ , we first find out (in  $O(\log n)$  time with  $O(n + m)/\log n$  processors) those  $i$  representing a module such that  $D_i$  has only strong neighbors as weak neighbors. Then we find out those  $i$ , such that  $i$  and  $i+1$  represent modules,  $D_i$  and  $D_{i+1}$  have only strong neighbors as weak neighbors, and  $D_i$  and  $D_{i+1}$  have the same number of strong neighbors. This is done in constant time with  $O(n)$  processors. This enables us to find the left and right borders of such intervals  $I$  in constant time with  $O(n)$  processors. To get the intervals, we compute, for each  $i$  the maximum left border of such an interval, using parallel prefix computation ( $O(\log n)$  time and  $O(n/\log n)$  processors). Especially we have, for each right border, its corresponding left border and therefore all the intervals  $I$  representing a negatively degenerated module.

5. We compute the positively degenerated modules containing  $u$  as follows. For each  $i$  representing a module, we determine the set  $P_i := \{C : C \text{ strong neighbor of all } D_j, j \geq i \text{ and } C \text{ not neighbor of some } D_j, j < i\} = \{C | Min(C) = i \text{ and } Max(C) = i - 1\}$ . This can be done in  $O(\log n)$  time with  $O(n/\log n)$  processors. If  $P_i \neq \emptyset$  then there is a positively degenerated module  $PD_i$  consisting of all  $C \in P_i$  and a module  $U_i$  consisting of  $u$ , all vertices in some  $D_j, j \geq i$ , and all vertices in some  $C$  with  $Max(C) > i$  as child modules. If  $P_i$  is not empty then we say that  $i$  represents a positively degenerate module.



(Note that it can be checked in constant CRCW time with a linear number of processors whether  $P_i$  is empty or not). If there are 1-components that are even not weak neighbors of any 2-components then they form together with  $u$  a positively degenerate module. In that case,  $k + 1$  represents a positively degenerate module, where  $k$  is the largest index of a 2-component.

6. The prime modules are determined as follows. A prime module is necessarily a module  $U_i$  as defined in the last step and is a prime module if it does not appear in some interval  $I$  as defined in the step that determines the negatively degenerated modules.

We say that  $i$  *represents a prime module* if  $i$  represents a module and does not appear in an interval representing a negatively degenerated module. We can check whether  $i$  appears in an interval representing a prime module in logarithmic time, and for all  $i$  simultaneously, in the same time bound with a linear number of processors.

We have to complete the modular tree.

We get the following tree nodes that are created by the indices representing modules.

1. The tree nodes  $s_i$ , such that  $i$  represents a prime module containing  $u$ ,
2. the tree nodes  $t_i$ , such that  $i$  represents a positively degenerate module containing  $u$ , and
3. the tree nodes  $u_I$ , such that  $I$  represents a negatively degenerated module containing  $u$ .

We determine the parent function *Parent* of the modular tree as follows.

First we consider *Parent*( $u$ ). If  $k + 1$  represents a positively degenerated module then *Parent*( $u$ ) is set to be  $t_{k+1}$ . Otherwise let  $k'$  be the largest index that represents a module. We can determine  $k'$  by list ranking in  $O(\log n)$  time with  $O(n)$  processors [2]. If  $k'$  represents a prime module then *Parent*( $u$ ) is  $s_{k'}$ . Otherwise *Parent*( $u$ ) is the  $u_I$  such that  $I$  contains  $k'$ .

Next we consider the parents of  $s_i$ ,  $t_i$ , and  $u_I$ . For each  $i$  representing a module, we determine the largest  $i' < i$ , say  $P(i)$ , that represents a module, by list ranking [2] in  $O(\log n)$  time with  $O(n/\log n)$  processors.

Suppose  $i$  represents a prime module or is the smallest index of an interval  $I$  representing a negatively degenerated module. If  $i$  represents also a positively degenerated module then *Parent*( $s_i$ ) :=  $t_i$  or *Parent*( $u_I$ ) :=  $t_i$  respectively. If  $i$  does not represent a positively degenerate module then there are two possible cases.

- $P(i)$  (the next smaller  $i'$  representing a module) represents a prime module. Then *Parent*( $s_i$ ) :=  $s_{P(i)}$  or *Parent*( $u_I$ ) :=  $s_{P(i)}$ .
- $P(i) = i - 1$  and  $i$  is the largest index of an interval  $I'$  representing a negatively degenerate module. Then *Parent*( $s_i$ ) and *Parent*( $u_I$ ) are set to be  $u_{I'}$  respectively.

If  $i$  represents a positively degenerated module then there are the same two possible cases as mentioned above and *Parent*( $t_i$ ) =  $s_{P(i)}$  if  $P(i)$  represents a

prime module and  $Parent(t_i) := u_{I'}$  if  $P(i)$  appears in the interval  $I'$  representing a negatively degenerate module.

It remains to determine the parents of tree nodes representing modules that are subsets of  $L_1$  or  $L_2$ .

We have to determine the parents of homogeneous nodes with an inhomogeneous parent that have not a new node as new parent and the parents of new nodes.

Let  $t$  such a node. We first determine (by list ranking in  $O(\log n)$  time with  $O(n/\log n)$  processors) a leaf descendent  $v_t$  of  $t$ . Note that  $v_t$  is a vertex of  $L_1$  or  $L_2$ . We determine the 1- or 2-component  $C_t$  or  $D_t$   $v_t$  belongs to (in constant time with  $O(n)$  processors).

Suppose  $t$  represents a module in  $L_2$  and let  $D_t = D_i$ . Then  $i_t$  is the largest index  $\leq i$  representing a module. Note that  $i_t = P(i+1)$  and that  $i_t$  therefore can be determined in constant time. If  $i_t$  represents a prime module then  $Parent(t)$  is set to be the node  $s_{i_t}$  representing this prime module. If  $i_t$  is in an interval  $I$  representing a negatively degenerate module (this  $I$  can be determined in constant time) then  $Parent(t)$  is set to be  $u_I$  if  $t$  does not represent a negatively degenerate module. Otherwise  $t$  and  $u_I$  are contracted to one node. Note that in that case,  $i = i_t$ .

Suppose  $t$  represents a module in  $L_1$ . Note that all vertices of  $L_2$  that are leaf descendents of  $t$  have the same neighbors in  $L_2$ .

**First case:**  $Min(C_t) = Max(C_t) + 1$  and  $i = Min(C_t)$  represents a module.

Then  $i$  also represents a positively degenerated module and  $C_t$  belongs to the positively degenerated module  $t_i$ . If  $t$  itself represents a positively degenerate module then  $t$  and  $t_i$  are contracted to one node. If  $t$  does not represent a positively degenerate (this is only possible if  $t$  represents exactly the module  $C_t$ ) then  $Parent(t)$  is set to be  $t_i$ . This part can be done in constant time with a linear processor number)

**Second case:**  $Min(C_t) \leq Max(C_t)$  or  $Min(C_t)$  does not represent a module.

Let  $i_t$  be the largest  $j \leq Min(C_t)$  representing a module (in constant time by knowledge of  $P(i_t + 1)$ ).  $Parent(t)$  is just the prime module  $s_{i_t}$ . Note that  $i_t$  cannot appear in an interval representing by a negatively degenerate module.

Therefore:

**Lemma 2.** *If the conditions of the first case are satisfied then one recursion step can be done in logarithmic time with a linear processor bound on a CRCW-PRAM.*

### 3.2 Second Case: All Vertices are Low Degree Vertices

Here we proceed in a similar way as in the low degree refinement of the perfect elimination ordering algorithm of Klein [8]. We compute a spanning forest  $F$  of  $G$  (in  $O(\log n)$  time with  $O(n + m)$  processors [13]). The connected components of  $G$ , i.e. the trees of  $F$  are modules. If  $G$  is not connected then the whole vertex

set  $V$  forms a negatively degenerated module. For each tree  $T$  of  $F$  with a root  $u$ , we compute a preorder  $\{u_1, \dots, u_n\}$  of  $T$ . We set  $L_1 := \{u\}$  and

$$L_{i+1} := \{x | u_i \text{ is the neighbor of } x$$

with minimum index  $\}$ .

By a similar argument as in the first case, each module not containing  $u$  is a subset of some  $L_i$ . To compute the modules in  $L_i$ , we compute, as in the first case, the modules of  $G$  restricted to  $L_i$  and compute, in the same way as in the first case, the modules of  $G$  in  $L_i$  by comparison of the neighborhood outside  $L_i$ .

The modules containing  $u$  can be found out in the same way as the modules containing  $u$  in the first case.

The processor and time bounds of one recursion step are therefore as in the first case.

### 3.3 Third Case: All Vertices are of Low or High Degree

We distinguish between *small* modules that contain only  $1/4|V|$  vertices and *large* modules that contain more than  $1/4|V|$  vertices.

**Lemma 3.** *If  $X$  is a small module then all vertices of  $X$  are of low degree or all vertices of  $X$  are of high degree.*

*Proof.* Suppose  $|X| < 1/4|V|$ ,  $x, y \in X$ ,  $\text{degree}(x) < 1/4|V|$ , and  $\text{degree}(y) > 3/4|V|$ . Then  $x$  has at most  $1/4|V|$  neighbors outside  $X$  and  $y$  has at least  $1/2|V|$  neighbors outside  $X$ . Q.E.D.

**Lemma 4.** *If  $X$  is a large module then all neighbors of  $X$  that are not in  $X$  are of high degree.*

Therefore

**Lemma 5.** *If  $X$  is a large module containing low degree and high degree vertices then the set  $X'$  of low degree vertices of  $X$  is a union of connected components of  $G$  restricted to the set of low degree vertices.*

**Corollary 6.** *If  $X$  is a large module containing low degree and high degree vertices then the set  $X''$  of high degree vertices of  $X$  is a union of connected components of the complement of  $G$  restricted to the set of high degree vertices.*

First, we compute all modules of the set  $L$  of low degree vertices and of the set  $H$  of high degree vertices. The modules of  $L$  are computed as in the second case. To compute the modules of  $H$ , we first compute the complement of  $G$  restricted to  $H$ , and afterwards, we proceed as in the second case. Note that the number of edges in  $G$  restricted to  $H$  is smaller than the number of edges adjacent to some vertex in  $H$  and therefore the number of edges of the

complement of  $G$  restricted to  $H$  is  $O(m)$ . By comparison of neighbors outside  $L$  or  $H$ , we get all modules in  $L$  and  $H$  that are also modules of  $G$ . By previous lemma and corollary, modules having high degree and low degree vertices satisfy the same conditions as modules containing the set  $u$  in the first case. In so far, we can determine them in the same way as in the first case.

Again, as in the second and first case, one recursion step can be done in  $O(\log n)$  time with  $O(n + m)$  processors.

## 4 Complexity Analysis

In all three cases, the problem of modular decomposition is reduced to components of size at  $3/4$  of the number of vertices. Therefore the recursion depth is  $O(\log n)$ . In all three cases, one recursion can be done in  $O(\log n)$  time by a CRCW-PRAM with  $O(n + m)$  processors. Therefore the overall complexity on a CRCW-PRAM is of  $O(n + m)$  processors and  $O(\log^2 n)$  time.

**Theorem 7.** *Modular decomposition can be done by a CRCW-PRAM in  $O(\log^2 n)$  time with  $O(n + m)$  processors.*

## 5 Conclusions

The linear time modular decomposition algorithms of [9, 4] is quite complicated. It should not be too difficult to transform the parallel modular decomposition algorithm as presented here to a simpler linear time algorithm. It is almost obvious how to turn the algorithm as presented here into an  $O(n + m) \log n$  algorithm. One might also ask whether the techniques can be applied to other structures like directed graphs or graphs with colored edges. We believe that this is possible with not too much effort.

Very related to the problem of modular decomposition is also the problem of transitive orientation of an undirected graph [12]. Further research should be done to extend the algorithm presented in this paper to an efficient parallel algorithm for transitive orientation and permutation graph recognition. Note that permutation graphs are exactly those graphs which are transitively orientable and where the complement is transitively orientable.

The parallel modular decomposition algorithm induces also a parallel cograph recognition algorithm and therefore generalizes a result of X. He [7]. An improved cograph algorithm working in  $O(\log^2 n)$  time on a CREW-PRAM with a linear processor number is developed in [5].

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