

# Applications of a Subset-Generating Algorithm to Base Enumeration, Knapsack and Minimal Covering Problems

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On the basis of a backtrack procedure for lexicographic enumeration of all subsets of a set of  $n$  elements, we give an algorithm both for determining all bases consisting of functions from a given complete set in a considered subset of the set of  $k$ -valued logical functions, and for enumeration of all classes of bases in the subset. We use the lexicographic algorithm also for solving knapsack and minimal covering problems. A cut technique is described which is used in these algorithms to reduce the number of examined subsets of  $\{1, \dots, n\}$ .

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## 1. GENERATING ALL SUBSETS OF $\{1, \dots, n\}$ IN LEXICOGRAPHIC ORDER

In this section we consider the problem of generating all  $r$ -subsets (subsets containing  $r$  elements) of the set  $\{1, 2, \dots, n\}$  for  $1 \leq r \leq n$  and for  $1 \leq r \leq m \leq n$ . We assume that each subset will be represented as a sequence  $a_1 a_2 \dots a_r$ , where  $1 \leq a_1 < \dots < a_r \leq n$ .

Recall definition of lexicographic order of subsets. For two subsets  $a = (a_1, \dots, a_p)$  and  $b = (b_1, \dots, b_q)$ ,  $a < b$  is satisfied if and only if there exists  $i$  ( $1 \leq i \leq q$ ) such that  $a_j = b_j$  for  $1 \leq j < i$  and either  $a_i < b_i$  or  $p = i - 1$ . This order has an important property that enables simple calculation with  $r$ -subsets.

Ehrlich<sup>2</sup> described a loopless procedure for generating subsets of a set of  $n$  elements. A procedure based on Gray code for the same problem is given in Ref. 13, where an algorithm for generating all  $r$ -subsets ( $1 \leq r \leq m \leq n$ ) in lexicographic order is also proposed. Semba<sup>18</sup> improved the efficiency of the algorithm; we shall modify his algorithm by presenting it in Pascal-like notation without goto statements. Application of the algorithm for minimal covering problems results in another modification of the algorithm in the case  $1 \leq r \leq m \leq n$ .

The lexicographic enumeration of  $r$ -subsets goes in the following manner (for example, let  $n = 5$ ):

```

1, 12, 123, 1234, 12345,
   1235,
   124, 1245,
   125,
13, 134, 1345,
   135,
14, 145,
15,
2, 23, 234, 2345,
   235,
   24, 245,
   25,
3, 34, 345,
   35,
4, 45,
5.
```

The algorithm is in *extend* phase when it goes from left to right staying in a row. If the last element of a subset is  $n$ , the algorithm shifts to the next row. We call this the *reduce* phase.

Every subset of  $\{1, \dots, n\}$  is represented in the algorithm below by a sequence  $j_1, \dots, j_r$ ,  $1 \leq r \leq n$ ,  $1 \leq j_1 < \dots < j_r \leq n$ .

First we give an algorithm for generating all  $r$ -subsets for  $1 \leq r \leq n$ . This algorithm will be used in base enumerations.

```

begin
  read (n); r := 0; j_r := 0;
  repeat
    if j_r < n then extend else reduce;
    print out j_1, ..., j_r
  until j_1 = n
end;
extend ≡ begin j_{r+1} := j_r + 1; r := r + 1 end
reduce ≡ begin r := r - 1; j_r := j_r + 1 end.
```

Note that between any two printed subsets exactly two conditions are checked  $j_r < n$  and  $j_1 = n$ .

The algorithm for generating all  $r$ -subsets for  $1 \leq r \leq m \leq n$  we modify with respect to its use in minimal covering problems.

```

begin
  read (n); r := 0; j_r := 0;
  repeat
    if j_r < n and r < m then extend else cut;
    print out j_1, ..., j_r
  until j_1 = n
end;
extend ≡ begin j_{r+1} := j_r + 1; r := r + 1 end
reduce ≡ begin r := r - 1; j_r := j_r + 1 end
cut ≡ if j_r < n then j_r := j_r + 1 else reduce.
```

Besides *extend* and *reduce* phases we use in the algorithm a new phase called *cut*. The phase will be used when the algorithm goes from one subset to a subset in a lower row (not necessarily in the subsequent row), skipping several subsets (when the number  $r$  of elements in these subsets is greater than  $m$ ).

## 2. FUNCTIONAL COMPLETENESS AND ENUMERATION OF BASES

In this section we describe an application of our lexicographic algorithm to base enumeration for a subset of the set of  $k$ -valued logical functions.

Let  $E_k = \{0, \dots, k-1\}$ . The set of  $k$ -valued logical functions, i.e. the union of all the functions  $\{ | E_k^n \rightarrow E_k$  for  $n = 0, 1, 2, \dots \}$  is denoted by  $P_k$  is said to be **closed**

if it contains all superpositions of its members (cf. Refs. 4, 5 and 16). For closed sets  $F$  and  $H$  such that  $F \subset H$  (proper inclusion),  $F$  is **H-maximal** set if there is no closed set  $G$  such that  $F \subset G \subset H$ . A subset  $X$  of  $H$  is **complete in  $H$**  if  $H$  is the least-closed set containing  $X$ . If the number  $d$  of  $H$ -maximal sets is finite a subset of functions in  $H$  is complete in  $H$  if and only if it is not contained in any one  $H$ -maximal set (completeness condition) (cf. Ref. 5). Investigations of completeness and related topics, which are usually called functional completeness problems, are directly related to logical circuit design, and they have a wide area of applications in addition to their mathematical importance.

A complete set  $X$  in  $H$  is called a **base of  $H$**  if no proper subset of  $X$  is complete in  $H$ . A set of functions  $F = \{f_1, \dots, f_s\}$  is called **non-redundant in  $H$** , if for each  $i$ ,  $1 \leq i \leq s$ , there exists an  $H$ -maximal set  $H_j$ ,  $1 \leq j \leq d$  which does not contain  $f_i$ , while all the other functions  $f_l$  ( $l = 1, \dots, s, l \neq i$ ) are elements of  $H_j$  (non-redundancy condition). From these definitions it follows that a complete non-redundant set is a base. We call non-redundant incomplete sets simply **addable**. The **rank** of a base (addable set) is the number of its elements.

We classify the set  $H$  of functions into non-empty equivalence classes by using all its maximal sets as indicated below. Then we can discuss the completeness properties in  $H$  in terms of these classes instead of individual functions; if a set is complete (non-redundant), replacing a function in the set by any function in the corresponding equivalence class yields another complete (non-redundant) set.

The **characteristic vector** of  $f \in H$  is  $c_1 \dots c_d$ , where  $c_i = 0$  if  $f \in H_i$  and  $c_i = 1$  otherwise ( $1 \leq i \leq d$ ). Whenever it is possible to avoid confusion we call characteristic vectors simply vectors. All functions  $f \in H$  with the same (characteristic) vector form a **class of functions**. For a base its **class of bases** is the set of classes of functions for functions belonging to the base.

The conditions of completeness and non-redundancy of a set of (classes of) functions  $F$  can be conveniently expressed by using characteristic vectors of (classes of) functions belonging to  $F$ . We can say that a base corresponds to a minimal cover of  $1 \dots 1$  (unit vector), and a non-redundant set corresponds to a minimal cover of some non-unit vector (in which some 0s may occur; we except null vector).

We define bitwise **or** operation  $\vee$  for characteristic vectors in the following way:

$$(a'_1, \dots, a'_d) \vee (a''_1, \dots, a''_d) = (a'_1 \vee a''_1, \dots, a'_d \vee a''_d).$$

Criteria for the completeness and non-redundancy of a set  $a_1, \dots, a_r$  of characteristic vectors are respectively the following:

$$(1) a_1 \vee \dots \vee a_r = 1 \dots 1 \quad (\text{completeness}) \quad (2.1)$$

$$(2) a_1 \vee \dots \vee a_{j-1} \vee a_{j+1} \vee \dots \vee a_r \neq a_1 \vee \dots \vee a_r \quad \text{for each } j = 1, \dots, r \quad (\text{non-redundancy}). \quad (2.2)$$

Thus any set containing null class (whose vector is  $0 \dots 0$ ) is redundant. Addable sets are non-redundant, but not conversely.

If we have a complete list of characteristic vectors for non-empty classes of functions of a set, we can enumerate all its classes of bases.

As an example, assume a set  $M$  contains 4 maximal sets  $M_1, M_2, M_3, M_4$  and 6 classes of functions: (1) 0011; (2) 0100; (3) 1000; (4) 0010; (5) 0001; (6) 0000.

For instance, class 1 is the set  $M_1 \cap M_2 \cap \overline{M}_3 \cap \overline{M}_4$ , where  $\overline{X} = M \setminus X$  (complement set).

$M$  has exactly two classes of bases:  $\{1, 2, 3\}$  and  $\{2, 3, 4, 5\}$ . We consider the class  $\{1, 2, 3\}$ . Bitwise **or** for the set results 1111 (completeness). Bitwise **or** for the set  $\{1, 2\}$  results 0111, for the set  $\{1, 3\}$  results 1011 and for the set  $\{2, 3\}$  results 1100 (non-redundancy).

The set  $\{1, 3, 4\}$  is redundant, because bitwise **or** for the sets  $\{1, 3, 4\}$  and  $\{1, 3\}$  are equal (to 1011).

### 3. THE LEXICOGRAPHIC ENUMERATION OF BASES AND CLASSES OF BASES

Let  $d$  and  $n$  denote the numbers of maximal sets and functions or classes of functions respectively. Then we are given  $n$  vectors with length  $d$ , indexed by  $1, \dots, n$ .

To perform an exhaustive enumeration of classes of bases we should enumerate every  $r$ -tuple of vectors  $a_1, \dots, a_r$  for each  $r = 2, \dots, d$  (for  $r = 1$  it is trivial) and check the completeness (2.1) and redundancy (2.2) conditions for them (rank  $r$  base criteria). However, this direct method does not work because of too many  $r$ -tuples to be generated. Suppose we are enumerating  $r$  vectors  $a_1, \dots, a_r$  for checking the base criteria. Instead of enumerating whole  $r$  vectors and checking criteria for them, we will inspect  $i$ -tuple of vectors  $a_1, \dots, a_i$  incrementary for  $i = 1, \dots, r$ , and at each  $i$ th stage we will certify (by examining simple conditions) that this  $i$ -tuple can or cannot be included in a rank  $r$  base (addable set). This idea of incremental check can be conveniently implemented in the lexicographic enumeration of subsets.

The lexicographic algorithm enumerates classes of bases and addable sets for every rank at the same time. Moreover, the maximal ranks of bases and addable sets are automatically given as a result.

Suppose we are enumerating taken  $r$  elements out of  $n$  objects stored in an array consecutively, i.e.  $a(1), \dots, a(n)$ . The selected indexes are to be stored in an array  $j$  as  $j_1, \dots, j_r$ ,  $1 \leq j_i \leq n$  for each  $i$ ,  $1 \leq i \leq r$ .

Suppose we are examining taken  $r$ -subset  $a(j_1), \dots, a(j_r)$ , where selected indexes are stored in an array  $j$  as  $j_1, \dots, j_r$ ,  $1 \leq j_1 < \dots < j_r \leq n$  and  $a(i)$  denotes  $a_i$ . There are three possible cases after the examination: redundant, base and addable set (i.e. non-base and non-redundant). The enumeration of subsets in lexicographic order can be controlled in the following manner.

If a  $r$ -tuple is either redundant or base it is unnecessary to *extend* it to  $r+1$ -tuple, since adding a new vector to them will result in redundancy; in the former case the  $r$ -tuple is already redundant and in the latter it is already complete. Hence in these cases we can bypass the lexicographic enumeration of subsets to an appropriate point. The next subset is  $j_1, j_2, \dots, j_{r-1}, j_r+1$  if  $j_r \neq n$ ; otherwise it is the next subset in lexicographic order and the bypass effects nothing. Thus only the remaining addable case can be extended.

As an example we consider the same set  $M$  as before. The class 6 (null class) is omitted. In this case  $n = 5$  and  $d = 4$ . The notions *extend*, *reduce*, *cut*, 'redundant', 'base' and 'addable' we denote simply by  $e, r, c, n, b, a$  respectively.

- {1} - a, e; {1, 2} - a, e; {1, 2, 3} - b, c;
- {1, 2, 4} - n, c;
- {1, 2, 5} - n, c, r;
- {1, 3} - a, e; {1, 3, 4} - n, c;
- {1, 3, 5} - n, c, r;
- {1, 4} - n, c;
- {1, 5} - n, c, r;
- {2} - a, e; {2, 3} - a, e; {2, 3, 4} - a, e; {2, 3, 4, 5} - b, c, r;
- {2, 3, 5} - a, r;
- {2, 4} - a, e; {2, 4, 5} - a, r;
- {2, 5} - a, r;
- {3} - a, e; {3, 4} - a, e; {3, 4, 5} - a, r;
- {3, 5} - a, r;
- {4} - a, e; {4, 5} - a, r;
- {5} - a.

We can write our algorithm as follows. Let  $b_r$  be the number of (classes of) bases of rank  $r$ .

```

begin
  read n, d, a(i), i := 1, n; r := 1; j_1 := 1;
  repeat
    if a(j_1), ..., a(j_r) is addable
      then if j_r < n
        then extend
        else reduce
      else begin
        if a(j_1), ..., a(j_r) is a base then b_r := b_r + 1; cut;
        end
      until j_1 = n;
    print out b_i, 1 ≤ i ≤ d
  end.

```

In the algorithm *extend*, *reduce* and *cut* are defined as before.

Note that the last set  $\{n\}$  is not checked in the algorithm. It can easily be done before printing results.

#### 4. REDUNDANCY CHECKS

We describe a technique (called bitwise pivotality checks) to reduce the computation in redundancy checks.

Suppose we are checking redundancy of  $a_1, \dots, a_r$  (for simplicity we write  $a_i$  for  $a(j_i)$ ). For every redundancy check we know that  $a_1, \dots, a_{r-1}$  are included in the tuple which we examined just before (only  $a_r$  is a newly added vector). Thus we can assume that we already have  $R_k = a_1 \vee \dots \vee a_k$  for  $1 \leq k \leq r-1$  in an array  $R$  (for a convenience we add  $R_0$  and assume  $R_0 = 0$ ).

The redundancy condition for the  $r$ -tuple can be formulated in the following way (we use a variable  $B$  to reduce the number of bitwise or operations).

For  $r \geq 2$ .

$$R_r = R_{r-1} \vee a_r \text{ and } R_{r-1} \neq R_r, \tag{4.1}$$

$$B = B \vee a_{k+1} \text{ (initial } B = 0) \text{ and } R_{k-1} \vee B \neq R_r \text{ for } k = r-1, \dots, 1 \tag{4.2}$$

For  $r = 1$ .

$a_1$  is addable if it is neither null vector nor unit vector (if  $a_1$  is a unit vector then it is a base)

The program checks (4.1) and (4.2) for  $k = r, \dots, 1$ ;  $k \geq 2$  in this order, and whenever a condition is not satisfied the check ends immediately with redundancy result.

For a rank  $r$  redundancy check we need at most  $r$  comparisons and at most  $2r-1$  bitwise or operations.

If the number of components  $d$  in vectors  $a_i$  is less than the number of bits (usually 16 or 32) of given computer it is possible to represent a vector  $a_i$  by an integer number  $c_1 + 2 \cdot c_2 + \dots + 2^{d-1} \cdot c_d$ , where  $c_1 c_2 \dots c_d$  are the components of the vector  $a_i$ . In the redundancy check we can treat these vectors as integer numbers because or operation between integer numbers is defined as a machine instruction or between corresponding components of their binary notations.

Otherwise bitwise or can be realized with (characteristic) vectors as an array of  $d$  elements. However, in this case there is another technique called counter-redundancy check which is proved faster as well.

In the check of redundancy we use two auxiliary sequences  $s_i$  ( $1 \leq i \leq d$ ) and  $p_i$  ( $1 \leq i \leq r$ ).  $s_i$  is the number of units in the  $i$ th position in the vectors  $p(j_1), \dots, p(j_{r-1})$ . The sequence  $p_1, \dots, p_r$  has the following property:  $p_i$ th position of each vector is equal to 1 only for  $p(j_i)$  (it is equal to 0 for the vectors  $p(j_t)$ ,  $1 \leq t \leq r$ ,  $t \neq i$ ).

The lexicographic algorithm presented can also be supplemented with this technique.

Note that the algorithm with bitwise redundancy check using machine command is proved to be about twice as fast (when  $n$  is about 500 and  $d$  is about 15) than one with counter-redundancy check.

Applying this algorithm, classes of bases for several subsets of  $P_k$  are determined (cf. Ref. 12).

$P_3$  has exactly 18 maximal sets<sup>5</sup> and 406 classes of functions<sup>10,19</sup>. We present the numbers of classes of bases of  $P_3$  of each rank in Table 1. The lexicographic enumeration algorithm with this bitwise redundancy check requires about 16 minutes computer time (the computer FACOM M380 is used). The total number of examined tuples is  $N = 194759642$  for the classes of functions sorted according first to the number of units in the vector, and then sorted lexicographically within the same group. Bearing in mind the total number of subsets  $2^{406}$ , we can calculate the efficiency of cut technique in this case. The program generates in the average 4.41-tuple and consumes in the average 2.17 bitwise or operations to recognize whether it is a base, addable or redundant (bitwise redundancy check is used). Note that computer time depends on the order of characteristic vectors.

#### 5. APPLICATION OF THE BASE ENUMERATION ALGORITHM

Kabulov<sup>6</sup> considered the following problem. Given a complete set  $F$  of functions from  $P_k$  together with the Boolean matrix displaying the relation  $\in$  between the

Table 1.

Rank	1	2	3	4	5	6	$\Sigma$
Bases	1	8265	794256	4612601	810474	141124	6239721

members of  $F$  and maximal sets in  $P_k$  (i.e. with characteristic vectors of functions in  $F$ ), determine all bases composed from functions of the set  $F$ . He described a method, using Boolean expressions, to solve this problem.

We can apply the same algorithm described in section 3 to this problem, because each function is represented by its class of functions. The output in this case is exactly bases instead of classes of bases. Note that in the considered application several functions may have the same characteristic vector. However, they compose different bases.

Our algorithm can be used to calculate the number of (classes of) bases composed from vectors  $m + 1, \dots, n$  at the same time (for a given  $m \leq n$ ), because in the lexicographic order we examine first all subsets containing vector 1, then all subsets containing vector 2, etc.

In Refs. 9, 14 and 20 procedures for determining the number of bases of  $P_2$  consisting of  $n$ -ary functions are described and computational results for  $n = 2$  and  $n = 3$  are obtained. There exist no formulae for numbers of  $n$ -ary functions in some classes of function of  $P_2$ , because the number of  $n$ -ary monotone functions in  $P_2$  is not known. We present another approach to this problem. It is divided into several subproblems.

- (1) determination of classes of functions for considered set (not limited to  $P_2$ ),
- (2) determination of the number of  $n$ -ary functions in each class,
- (3) determination of all classes of bases,
- (4) determination of numbers of bases containing  $n$ -ary functions (or functions with at most  $n$  variables).

The methods presented in Refs. 9, 14 and 20 use only step (4) for  $P_2$ . Our method can be applied for solving (3) assuming that (1) is already solved. Also, our algorithm can be applied for solving (4) assuming that (2) is solved by applying another procedure. Note that (2) can be done without solving (1) because for each function  $f$  we can determine a corresponding class of functions. It is sufficient to check inclusion of  $f$  in each maximal set of considered closed set; such procedure can be easily written using description of maximal sets<sup>16</sup>. In this manner we can determine classes of functions containing  $n$ -ary functions. We can apply our algorithm to count bases. We obtain the number of bases containing  $n$ -ary functions in a class of bases by multiplying the numbers of  $n$ -ary functions in the classes of functions which compose the base, whenever a class of bases is found. During this procedure we can also enumerate classes of bases consisting of classes of  $n$ -ary functions.

Following this description we determined the number of bases of Boolean functions composed from  $n$ -ary functions for  $n \leq 4$ . The data obtained are presented in Table 2. For  $n = 2$  this result is derived by Wernick,<sup>20</sup> and for  $n = 3$  by Kudielka and Oliva<sup>9</sup>. Note that the set  $P_2$  of Boolean functions contains 5 maximal sets<sup>15</sup>, 15 classes of functions<sup>4,3</sup> and <sup>8</sup> and 42 classes of bases<sup>3,8</sup>.

Table 2.

$n$	2	3	4
Bases	32	6664	275790502

## 6. MINIMAL COVERING PROBLEM

Minimal covering problem is a famous combinatorial problem and there exist a list of solutions for it (cf. Refs. 17 and 21). We will give a solution using the lexicographic enumeration of subsets.

The minimal covering problem is the problem of minimising the objective function  $x_1 + \dots + x_n$ , subject to constraints

$$(x_1, \dots, x_n)A \geq (1, \dots, 1) \quad (6.1)$$

where  $A = [a_{ij}]$  is an  $n \times d$  coefficient matrix with  $a_{ij} = 0$  or 1, and each variable  $x_j$  is 0 or 1 for each  $j$ .

We will introduce some new notions in order to give a new solution for the problem and to show connection between minimal covering problem and base enumeration.

A vector  $(x_1, \dots, x_n)$  satisfying (6.1) is called **complete** for  $A$ . We call a vector  $(x_1, \dots, x_n)$  **non-redundant** in  $A$  if

$$(x_1, \dots, x_n)A > (y_1, \dots, y_n)A$$

is valid for each vector  $(y_1, \dots, y_n)$  for which  $y_i \leq x_i$  for each  $i$ ,  $1 \leq i \leq n$  and  $y_1 + \dots + y_n < x_1 + \dots + x_n$  is satisfied.

A vector  $(x_1, \dots, x_n)$  is called **base** in  $A$  if it is complete and non-redundant in  $A$ . Non-redundant non-complete vectors we call simply **addable**. The **rank** of a base (addable set)  $(x_1, \dots, x_n)$  is the sum  $x_1 + \dots + x_n$ . Thus minimal covering problem is the problem of finding a base in  $A$  with minimal rank.

There is another definition of minimal covering problem<sup>7</sup>. For a given collection  $C$  of subsets of a finite set and positive integer  $r \leq |C|$  decide whether  $C$  contains a cover for  $S$  of size  $r$  or less, i.e. a subset  $C' \subseteq C$  with  $|C'| \leq r$  such that every element of  $S$  belongs to at least one member of  $C'$ . This problem is exactly to find a base with rank  $r$  or less, if we represent a subset by  $n$  bits characteristic vector. Karp<sup>7</sup> proved that this problem is NP-complete.

The notions of addable sets, bases and rank have almost the same meaning in both base enumeration and minimal covering problem. Minimal covering problem corresponds directly to finding a base with minimal rank. This we can modify our algorithm so that once we find a base with rank  $r$  no subset of rank  $\geq r$  will be considered further.

In the presented branch and bound algorithm  $a(i)$  denotes the  $i$ th row of matrix  $A$  ( $1 \leq i \leq n$ ), i.e.  $a(i) = (a_{i1}, \dots, a_{in})$ . We suppose that minimal rank of bases (solution of our problem) is between 2 and  $n - 1$  to make our algorithm shorter. It is easy to improve our algorithm to deal with these cases. Also some techniques for eliminating some rows or columns (cf. Ref. 17) can be applied before running the algorithm.

**begin**

  read  $n, d, a(i), i = 1, n; \text{minrank} := d; r := 1; j_1 := 1;$   
 $T := \{1\};$

**repeat**

**if**  $a(j_1), \dots, a(j_r)$  is addable in  $A$

**then if**  $j_r < n$  and  $r < \text{minrank} - 1$

**then extend**

**else cut**

**else begin**

**if**  $a(j_1), \dots, a(j_r)$  is a base in  $A$  **then**

```

begin
  minrank = r;
  t := {j1, ..., jr};
  end;
  cut
end
until j1 = n or minrank = 2;
  print out minrank, T
end.

```

*extend* and *cut* are defined as before. Note that  $T$  corresponds to a solution  $(x_1, \dots, x_n)$  of minimal covering problem so that  $x_j = 1$  if and only if  $j \in T$ .

### 7. KNAPSACK PROBLEM

An input for the knapsack problem consists of integer numbers  $a_1, \dots, a_n, C$ . The problem is to find a subset  $T$  of  $\{1, \dots, n\}$  to maximise  $\sum_{i \in T} a_i$  subject to the requirement that  $\sum_{i \in T} a_i \leq C$ . A more general formulation of the knapsack problem has more applications than this. Namely the input consists of  $C$  and two sequences  $a_1, \dots, a_n$  and  $p_1, \dots, p_n$ . The problem is to maximise  $\sum_{i \in T} p_i$  subject to the restraint  $\sum_{i \in T} a_i \leq C$  where  $T$ , as before, is a subset of the indexes.

We give a solution for a more general knapsack problem based on the lexicographic order of subsets. Elements  $i$  that are  $a_i$  greater than  $C$  should be eliminated. In the presented algorithm  $a(j_i)$  denotes  $a_{j_i}$ .

```

begin
  read n, d, ai, pi, i = 1, n;
  r := 1; j1 := 1; maxsum := p1; T := {1};
  repeat
    S := a(j1) + ... + a(jr);
    if S ≤ C
      then begin
        P := p(j1) + ... + p(jr);
        if P > maxsum then begin
          maxsum := P;
          T := {j1, ..., jr}
        end;
      end
    if jr < n then extend else reduce
  end
end

```

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```

else cut;
until j1 = n;
  print out maxsum, T
end.

```

In the algorithm *extend*, *reduce* and *cut* are defined as before. The set  $\{n\}$  should be examined before printing.

### 8. CONCLUDING REMARKS

In this paper we modified backtrack procedures for lexicographic enumeration of subsets and applied the procedure to the base enumeration, knapsack and minimal covering problems. Several variational uses of base enumeration algorithm are presented. The presented *cut* techniques use special properties of bases and addable sets, owing to which, for instance, base enumeration was possible for about  $n = 600$  (for the case  $n = 605, d = 15$  it took about 8 hours using bitwise redundancy check by FACOM 380 computer with 24 mips).

Karp<sup>7</sup> proved that the problem of determining a covering set with rank  $\leq r$  for given  $r$  is NP-complete. Our algorithms are directly related to the problem. Thus any algorithm for solving these problems takes exponential time according to numbers of rows and columns  $n$  and  $d$ . There exist a number of algorithms for exact and approximate solution of knapsack and minimal covering problems (see. for example, Refs. 1, 17 and 21).

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