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- ¿ Use a different citation style.
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# Charles University in Prague Faculty of Mathematics and Physics

#### MASTER THESIS



# Filip Bártek

# Minimum representations of Boolean functions defined by multiple intervals

Department of Theoretical Computer Science and Mathematical Logic

Supervisor of the master thesis: RNDr. Petr Kučera, Ph.D.

Study programme: Informatics

Study branch: Theoretical Computer Science

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Title: Minimum representations of Boolean functions defined by multiple intervals

Author: Filip Bártek

Department: Department of Theoretical Computer Science and Mathematical

Logic

Supervisor: RNDr. Petr Kučera, Ph.D., Department of Theoretical Computer

Science and Mathematical Logic

#### Abstract:

When we interpret the input vector of a Boolean function as a binary number, we define interval Boolean function  $f_{[a,b]}^n$  so that  $f_{[a,b]}^n(x) = 1$  if and only if  $a \le x \le b$ . Disjunctive normal form is a common way of representing Boolean functions. Minimizing DNF representation of an interval Boolean function can be performed in linear time. [4] The natural generalization to k-interval functions seems to be significantly harder to tackle. In this thesis, I discuss the difficulties with finding an optimal solution and introduce a 2k-approximation algorithm.

#### ¿ Remove citation from abstract.

Keywords: Boolean minimization, disjunctive normal form, interval functions

# Contents

In	trodi	uction	3
1	Defi 1.1 1.2 1.3 1.4 1.5 1.6 1.7	Vector operations Vector operations Binary vectors Boolean functions DNF representations of Boolean functions Ternary vectors Orthogonal sets and coverable functions Interval Boolean functions	44 44 55 57 8
2	1 <b>-i</b> n	terval functions	10
	2.1	Trivial cases	10 10 10 10
		2.2.1 Suffix case	10 11
	2.3	2.3.1 $a^{[1,2]} = 01$ and $b^{[1,2]} = 10$	12 12 13 13
3	2 <b>-in</b>	terval functions	15
	3.1	3.1.1 $b_1^{[1]} = a_2^{[1]}$	15 15 17 19
	5.2	5-SWITCH TUNCTIONS	10
4		Algorithm	21 21 21 21 22
5		1 1	<b>24</b> 24
Co	onclu	asion	<b>2</b> 6
Bi	bliog	graphy	27
$\mathbf{Li}$	st of	Tables	28

List of Abbreviations	29
Todo list	29

# Introduction

Boolean functions defined by intervals were introduced by Schieber et al. [4]. A pair of *n*-bit numbers a, b defines a 1-interval function  $f_{[a,b]}^n$ :

$$f_{[a,b]}^n(x) = 1 \iff a \le x \le b$$

Schieber et al. showed an efficient method to find minimum DNF representation of any 1-interval Boolean function given by a pair of endpoints.

Since the problem of Boolean minimization is in general  $\Sigma_2^p$ -complete [5], there is an interesting question of how difficult it is to minimize DNF representation of a function defined by a set of intervals. Dubovský investigated the problem for 2-interval functions.

In this thesis we review the existing results regarding minimization of DNF representations of single- and multi-interval functions, and then present 3 new results:

- a simplified algorithm for minimizing DNF representations of 2-switch 2-interval functions (section 3.1),
- show that the technique used for proving the optimality of the algorithms that minimize DNF representation of 1- and 2-switch (that is 1-interval and certain class of 2-interval) functions can not be used in functions with 3 or more switches (section 3.2) and
- introduce an algorithm for k-interval functions which gives a solution which is at worst 2k times larger than an optimal one (chapter 4).

Does Umans show this for term-wise minimization as well? Note that Čepek et al. uses  $\Sigma$  with CNF representations. Shouldn't one of the problems be  $\Pi_2$ -hard instead?

Define switch in Definitions.

¿ Mention the "Better approximation is hard" result.

# 1. Definitions

The basic terminology used in this thesis was introduced by Schieber et al. [4], Dubovský [1] and Hušek [2, 3].

### 1.1 Vector operations

Throughout the thesis we will use vectors over small finite domains extensively. We shall write a vector as a sequence of symbols and vectors. For example, if v is a vector of length n, then 00v11 denotes a vector of length n+4 whose leading two components have the value 0, trailing two components have the value 1 and i-th component for  $i \in \{3, \ldots, n+2\}$  has the value of the (i-2)-th component of v.

**Definition 1.1.1** (Component extraction  $v^{[i]}$ ). Let v be a vector of length n and  $1 \le i \le n$ . Then  $v^{[i]}$  is the i-th component of v.

**Definition 1.1.2** (Subsequence extraction  $v^{[a,b]}$ ). Let v be a vector of length n and  $1 \le a \le b \le n$ . Then  $v^{[a,b]}$  is the subvector of v that starts at a-th position and ends at b-th position  $(v^{[a,b]} = v^{[a]}v^{[a+1]} \dots v^{[b-1]}v^{[b]})$ .

Notably,  $v = v^{[1]} \dots v^{[n]} = v^{[1,n]}$ .

**Definition 1.1.3** (Symbol repetition  $\alpha^{\{n\}}$ ). Let  $\alpha$  be a symbol (for example 0 or 1) and  $n \in \{0, 1, ...\}$ . Then  $\alpha^{\{n\}}$  is the vector of length n each component of which is equal to  $\alpha$ .

For example  $0^{\{2\}} = 00$ .

#### 1.2 Binary vectors

**Definition 1.2.1** (Binary vector). We will use the term *binary vector* to denote a vector over the Boolean domain. That is, x is a binary vector if and only if  $x \in \{0,1\}^n$  for some  $n \in \{0,1,\ldots\}$ . We call such x an n-bit binary vector.

Note that an n-bit binary vector x represents the natural number  $\sum_{i=1}^n x^{[i]} 2^{n-i} = \sum_{i|x^{[i]}=1} 2^{n-i}$ . An n-bit vector corresponds to a number between 0 and  $2^n - 1$ . We will not differentiate between a number and its binary vector representation. Specifically, we will use a lexicographic linear ordering on binary vectors - for n-bit vectors a and b,  $a \leq b$  if and only if a = b or  $a^{[i]} = 0$  and  $b^{[i]} = 1$  where i is the smallest index such that  $a^{[i]} \neq b^{[i]}$ . Clearly, this ordering corresponds to the natural ordering on the represented numbers.

**Definition 1.2.2** (Most significant bit). The most significant bit (MSB) of a binary vector x is its first bit, that is  $x^{[1]}$ .

The *n* most significant bits of a vector form its prefix of length *n*, that is  $x^{[1,n]}$ .

¿ Change ... to ····

#### 1.3 Boolean functions

**Definition 1.3.1** (Boolean function).  $f: \{0,1\}^n \to \{0,1\}$  is an *n-ary Boolean function*.

Since we will not be dealing with any non-Boolean functions, in the remainder of the text, we will use the terms "function" and "Boolean function" interchangeably.

**Definition 1.3.2** (True point). Let f be an n-ary Boolean function. An n-bit binary vector x is a true point of f if and only if f(x) = 1.

Equivalently, we define a false point of f as any point x such that f(x) = 0. We'll denote the set of all true points of f as TP(f) and the set of all false points as FP(f).

#### 1.4 DNF representations of Boolean functions

Every n-ary Boolean function f can be expressed as a propositional formula  $\mathcal{F}$  on n variables  $x_1, \ldots, x_n$ . There's a natural bijection between binary vectors of length n and valuations of n variables (1-bits in the binary vector correspond exactly to 1-valued variables in the valuation).

**Definition 1.4.1** (Disjunctive normal form). A *literal* is an occurrence of a variable  $(x_i)$  or its negation  $(\overline{x_i})$  in a propositional formula.

A *term* is an elementary conjunction of literals, that is a conjunction in which every variable appears at most once.

A disjunctive normal form (DNF) propositional formula is a disjunction of terms.

We will often view terms as sets of literals and DNF formulas as sets of terms.

A DNF formula  $\mathcal{F}$  is a *DNF representation* of a Boolean function f if and only if  $(\forall x \in \{0,1\}^n)[f(x) = 1 \iff \mathcal{F}(x) \equiv 1]$ , where  $\mathcal{F}(x)$  is the formula given by substituting each occurrence of a variable  $x_i$  in  $\mathcal{F}$  with the value  $x^{[i]}$  for every  $i \in \{1, \ldots, n\}$ .

**Definition 1.4.2** (Minimum DNF representation). A DNF representation of function f is minimum if and only if there is no DNF representation of f with fewer terms.

We will denote the size of the minimum DNF representation of f by dnf(f).

The focus of this thesis is minimizing the number of terms of DNF representations of certain Boolean functions.

Note that a function may have more than one minimum DNF representation.

#### 1.5 Ternary vectors

**Definition 1.5.1** (Ternary vector). A ternary vector is a vector over the set  $\{0, 1, \phi\}$ .

There's a natural bijection between ternary vectors and terms (elementary conjunctions of literals). Each of the n components of a ternary vector T corresponds to an occurrence (or its absence) of one of the n variables of a term C:

i. Wrap in table environment and add a caption.

$$\begin{array}{c|c}
T^{[i]} & C \cap \{x_i, \overline{x_i}\} \\
\hline
\phi & \emptyset \\
1 & \{x_i\} \\
0 & \{\overline{x_i}\}
\end{array}$$

Note that since C is elementary, it can not contain both  $x_i$  and  $\overline{x_i}$  for any i. Namely, a binary vector (a ternary vector that does not contain any  $\phi$ ) corresponds to a full term (that is one that contains every variable), and the ternary vector  $\phi^{\{n\}}$  corresponds to the empty term (tautology).

It's easy to see that a set of ternary vectors, each of length n, corresponds to a DNF formula on n variables.

**Definition 1.5.2** (Spanning). A ternary vector T of length n spans a binary vector x of length n if and only if  $(\forall i \in \{1, ..., n\})[T^{[i]} = \phi \text{ or } T^{[i]} = x^{[i]}]$ .

The *i*-th symbol of a ternary vector constrains the *i*-th symbol of the spanned binary vector (or, equivalently, the valuation of the *i*-th variable). If  $T^{[i]}$  is a "fixed bit" (that is  $T^{[i]} \in \{0,1\}$ ), the spanned binary vector x must have the same value in its *i*-th position, that is  $x^{[i]} = T^{[i]}$ . If  $T^{[i]}$  is the "don't care symbol"  $\phi$ , the spanned binary vector may have any value in its *i*-th position.

**Definition 1.5.3** (Spanned set). Let T be a ternary vector of length n. We denote the set of points spanned by T as span(T):

$$span(T) = \{x \in \{0,1\}^n | T \text{ spans } x\}$$

Note that a ternary vector with m  $\phi$ -positions spans  $2^m$  binary vectors.

We'll also use a natural extension of spanning to sets of ternary vectors – if  $\mathcal{T}$  is a set of ternary vectors, then

$$span(\mathcal{T}) = \bigcup_{T \in \mathcal{T}} span(T)$$

**Definition 1.5.4** (Exact spanning). A ternary vector T of length n spans exactly a set of n-bit binary vectors S if and only if span(T) = S.

T spans exactly an n-ary Boolean function f if and only if span(T) = TP(f).

Again, we will generalize exact spanning to sets of ternary vectors – the set of ternary vectors  $\mathcal{T}$  spans exactly S if and only if  $span(\mathcal{T}) = S$ .

**Definition 1.5.5** (Spanning set). Let f be an n-ary Boolean function. The set  $\mathcal{T}$  of n-bit ternary vectors is a *spanning set* of f if and only if it  $\mathcal{T}$  spans exactly f, that is  $span(\mathcal{T}) = TP(f)$ .

In other words, a spanning set of a function spans all of its true points and none of its false points.

Note that spanning sets of a function correspond to DNF representations of the function. The correspondence preserves size (number of ternary vectors and terms, respectively), so a minimum spanning set corresponds to a minimum DNF representation.

**Definition 1.5.6** (Disjoint spanning set). A spanning set  $\mathcal{T}$  is *disjoint* if and only if the spanned sets of its vectors do not overlap, that is

$$(\forall T_i, T_j \in \mathcal{T})[T_i = T_j \text{ or } span(T_i) \cap span(T_j) = \emptyset]$$

In terms of DNF, disjoint spanning sets correspond to DNF formulas such that every valuation satisfies at most one term.

We have introduced two equivalent representations of Boolean functions – one based on ternary vectors and the other being the DNF representation. Table 1.1 shows the corresponding terms side by side.

ternary vector set binary vector set DNF formula
binary vector variable valuation
ternary vector spans a binary vector valuation satisfies a term
ternary vector set spans a binary vector valuation satisfies a DNF formula

Table 1.1: Corresponding terms used in Boolean function representations

**Definition 1.5.7** (Complement). The complement of a binary symbol  $\alpha$  ( $\alpha \in \{0,1\}$ ), denoted  $\overline{\alpha}$ , is  $1-\alpha$ .

We get the complement of a binary vector x by flipping all of its bits, that is  $\overline{x} = (\overline{x_1}, \dots, \overline{x_n}) = 1^{\{n\}} - x$ .

The complement of the  $\phi$  symbol is  $\phi$  ( $\overline{\phi} = \phi$ ).

It follows that we obtain the complement of a ternary vector by flipping all of its fixed bits.

#### 1.6 Orthogonal sets and coverable functions

**Definition 1.6.1** (Orthogonality). Let x, y be true points of Boolean function f(f(x) = f(y) = 1). x and y are orthogonal (with respect to f) if and only if every ternary vector that spans both x and y necessarily also spans a false point of f.

A set of true points S is *orthogonal* if and only if all the vectors in S are pairwise orthogonal.

This notion of orthogonality was introduced by Dubovský [1].

¿ Relate orthogonality to disjointness of essential sets. Don't forget to deal with DNF/CNF difference.

For a given f, we will call the size of its maximum orthogonal set ortho(f).

**Theorem 1.6.0.1** (ortho(f)  $\leq dnf(f)$ ). For any Boolean function, the size of its maximum orthogonal set is at most as great as the size of its minimum DNF representation.

Proof. We will prove the statement by contradiction. Let f be a Boolean function such that  $\operatorname{ortho}(f) > \operatorname{dn} f(f)$ . Let V be an orthogonal set of size  $\operatorname{ortho}(f)$  and  $\mathcal{T}$  be any spanning set of size  $\operatorname{dn} f(f)$  (such spanning set exists because of the correspondence between DNF representations and spanning sets). Since  $|\mathcal{T}| < |V|$  and  $\mathcal{T}$  spans  $\operatorname{TP}(f) \supseteq S$ , there must be a ternary vector  $T \in \mathcal{T}$  that spans two distinct vectors  $x, y \in V$ . However, since V is orthogonal, x is orthogonal to y, so T necessarily spans a false point, which contradicts the premise that  $\mathcal{T}$  is a feasible spanning set of f.

We conclude that the size of any orthogonal set is a lower bound on the size of minimum DNF representation. Specifically, if we show a DNF representation of a function and an orthogonal set of the same size, we conclude that the representation is minimum. The orthogonal set certifies optimality of the DNF representation.

**Definition 1.6.2** (Coverability). Let f be a Boolean function. f is *coverable* if and only if ortho(f) = dnf(f).

Informally speaking, a coverable function is one for which it may be easy to prove optimality of a spanning set. We will see in Chapters 2 and 3 that all 1-interval and a concise class of 2-interval functions are coverable. We will show examples of functions which are not coverable in section 3.2.

The concept of coverability was originally introduced by Cepek et al. [6]. They use a different yet equivalent definition. For brevity, we will omit proof of the equivalence and simply use Definition 1.6.2, which is sufficient for our purpose.

#### 1.7 Interval Boolean functions

**Definition 1.7.1** (k-interval Boolean function). Let  $a_1, b_1, \ldots, a_k, b_k$  be n-bit binary vectors such that  $0^{\{n\}} \leq a_1 \leq b_1 < a_2 \leq \cdots < a_i \leq b_i < a_{i+1} \leq \cdots < a_k \leq b_i \leq 1^{\{n\}}$ . Then  $f_{[a_1,b_1],\ldots,[a_k,b_k]}^n: \{0,1\}^n \to \{0,1\}$  is a function defined as follows:

$$f_{[a_1,b_1],\dots,[a_k,b_k]}^n(x) = \begin{cases} 1 & \text{if } a_i \le x \le b_i \text{ for some } i \\ 0 & \text{otherwise} \end{cases}$$

We call  $f_{[a_1,b_1],...,[a_k,b_k]}^n$  a k-interval Boolean function and the vectors  $a_1,b_1,\ldots,a_k,b_k$  its endpoints.

Note that the inequalities ensure that the intervals  $[a_i, b_i]$  are non-empty and don't intersect.

**Definition 1.7.2** (Proper k-interval Boolean function). Let  $f_{[a_1,b_1],\dots,[a_k,b_k]}^n$  be a k-interval Boolean function. If the endpoints satisfy the inequalities  $b_1 < a_2 - 1$ ,  $\ldots$ ,  $b_i < a_{i+1} - 1$ ,  $\ldots$ ,  $b_{k-1} < a_k - 1$  (in other words, adjacent intervals are separated by at least one false point), we call  $f_{[a_1,b_1],\dots,[a_k,b_k]}^n$  a proper k-interval Boolean function.

¿ Reword.

Is it actually equivalent?
Is "equivalent" a correct word, esp. since Cepek's coverability is in CNF (dual)?

¿ Write the proof. May require many definitions.

Especially,  $f_{[a,b]}^n$  is a function whose true points form the interval [a,b].

- $\mathcal{E}$  Define l-switch function.
- ¿ Show that complementing bits preserves number of switches.

Table 1.2 shows examples of interval functions.

Interval function	Propositional formula	Description
$f_{[1^{\{n\}},1^{\{n\}}]}^n$	$\bigwedge_i x_i$	Conjunction
$f^n_{[0^{\{n-1\}}1,1^{\{n\}}]}$	$\bigvee_i x_i$	Disjunction
$f_{[0^{\{n\}},1^{\{n\}}]}^n$	1 (an empty term)	Tautology
$f_{[0^{\{n-1\}}1,1^{\{n-1\}}0]}^{n}$	$\overline{x_1 \dots x_n} \wedge \overline{\overline{x_1} \dots \overline{x_n}} \equiv \bigvee_{i \neq j} x_i \overline{x_j}$	Non-equivalence
$f_{[0^{\{n\}},0^{\{n\}}],[1^{\{n\}},1^{\{n\}}]}^{n}$	$x_1 \dots x_n \vee \overline{x_1} \dots \overline{x_n}$	Equivalence

Table 1.2: Examples of interval functions

## 2. 1-interval functions

In this chapter, we will show an efficient way to compute a minimum spanning set of any 1-interval Boolean function defined by the interval endpoints. The algorithm was originally shown by Schieber et al. [4].

In the chapters that follow, we will use this algorithm as a procedure in order to span multi-interval functions.

In the remainder of this chapter, a and b ( $a \le b$ ) will denote the endpoints of the interval in question and n the number of input bits; we'll be looking for a minimum representation of function  $f_{[a,b]}^n$ .

**Input** *n*-bit numbers a, b such that  $a \leq b$ 

Output A set of ternary vectors

The algorithm differentiates various cases of input values and solves some of the cases by recursive calls.

Kučera

Buď rozvést nebo odstranit.

Bártek Rozvedeno; stačí takhle?

#### 2.1 Trivial cases

We will first deal with the trivial intervals.

**2.1.1** a = b

We span the interval [a, a] with the single ternary vector a.

**2.1.2**  $a = 0^{\{n\}}$  and  $b = 1^{\{n\}}$ 

From now on, let a < b.

We span the interval  $[0^{\{n\}}, 1^{\{n\}}]$  with the single ternary vector  $\phi^{\{n\}}$ , which corresponds to an empty term.

From now on, let  $a > 0^{\{n\}}$  or  $b < 1^{\{n\}}$ .

#### 2.2 Prefix and suffix case

Since we have dealt with the trivial cases, we are now left with the situation  $0^{\{n\}} < a < b < 1^{\{n\}}$  and  $a > 0^{\{n\}}$  or  $b < 1^{\{n\}}$ .

In this section we shall consider the prefix case, that is  $[0^{\{n\}}, b]$   $(a = 0^{\{n\}})$ , and the suffix case, that is  $[a, 1^{\{n\}}]$   $(b = 1^{\{n\}})$ .

#### 2.2.1 Suffix case

¿ Typeset "1-1" properly (correct dash etc.).

The prefix and suffix cases are complementary. There is a 1-1 correspondence between the spanning sets of suffix intervals and the spanning sets of prefix intervals. The correspondence spans the suffix interval  $[a, 1^{\{n\}}]$  by complementing each of the vectors in the spanning set of the prefix interval  $[0^{\{n\}}, \overline{a}]$ :

$$\mathcal{T}$$
 spans  $[a, 1^{\{n\}}] \iff \{\overline{T} | T \in \mathcal{T}\}$  spans  $[0^{\{n\}}, \overline{a}]$ 

#### ¿ Prove correctness.

Since the correspondence preserves size of the spanning sets, it also preserves optimality. Thus we can use the correspondence to optimally span suffix intervals using a procedure that spans prefix intervals. We will show such procedure in the following section.

#### 2.2.2 Prefix case

Let's proceed to span a prefix interval. Let  $a = 0^{\{n\}}$  and  $b < 1^{\{n\}}$ . Let c be the n-bit number b+1. Since  $b < 1^{\{n\}}$ , we do not need more than n bits to encode c.

The algorithm produces one ternary vector for each bit that is set to 1 in c. If o is a position of a 1 in c ( $c^{[o]} = 1$ ), then the corresponding ternary vector is  $c^{[1,o-1]}0\phi^{\{n-o\}}$ . Thus we get the following spanning set:

$$\mathcal{T} = \{c^{[1,o-1]}0\phi^{\{n-o\}}|c^{[o]} = 1\}$$

**Theorem 2.2.2.1** (Feasibility).  $\mathcal{T}$  spans exactly the interval  $[0^{\{n\}}, b]$ .

*Proof.* To see that every number spanned by  $\mathcal{T}$  is in  $[0^{\{n\}}, b]$ , note that given an index o of a bit which is set to 1 in c, the biggest number spanned by  $c^{[1,o-1]}0\phi^{\{n-o\}}$  is  $c^{[1,o-1]}01^{\{n-o\}}$  which is still strictly smaller than c.

On the other hand, consider a number x smaller than c and let o be the most significant bit in which x and c differ. It follows that  $x^{[1,o-1]} = c^{[1,o-1]}$  and  $0 = x^{[o]} < c^{[o]} = 1$ . Then  $c^{[1,o-1]}0\phi^{\{n-o\}} \in \mathcal{T}$  spans x.

**Theorem 2.2.2.2** (Optimality).  $\mathcal{T}$  is the minimum spanning set of  $f_{[0^{\{n\}},b]}^n$ .

*Proof.* We will construct an orthogonal set V of size  $|\mathcal{T}|$ . With the aid of Theorem 1.6.0.1, this proves that  $\mathcal{T}$  is a minimum spanning set.

Similarly to the spanning vectors, the orthogonal true points correspond to 1-bits of c:

$$V = \{c^{[1,o-1]}0c^{[o+1,n]}|c^{[o]} = 1\}$$

Clearly  $|V| = |\mathcal{T}|$ . Also note that all points in V are smaller than c, so they are true points.

We need to prove that V is orthogonal. Let  $x, y \in V$ ,  $x \neq y$ . Let  $o_x$  and  $o_y$  be the positions of the symbol 1 in c that were used to construct x and y  $(x = c^{[1,o_x-1]}0c^{[o_x+1,n]}, y = c^{[1,o_y-1]}0c^{[o_y+1,n]})$ . Since  $x \neq y$ , necessarily  $o_x \neq o_y$ .

Let T be any ternary vector that spans both x and y. To see that T must also span the false point c, note that every component i of c matches the respective component in at least one of x, y (for every i,  $c^{[i]} = x^{[i]}$  or  $c^{[i]} = y^{[i]}$ ).

Table 2.1 shows a more detailed comparison of the corresponding subvectors of x, y and c in case  $o_x < o_y$ .

We conclude that V is orthogonal and since  $|\mathcal{T}| = |V|$ ,  $\mathcal{T}$  is a minimum spanning set by Theorem 1.6.0.1.

tors created from different 1 bits in c must differ.

¿ Show in detail that vec-

	$[1, o_x - 1]$		$[o_x + 1, o_y - 1]$	$o_y$	$[o_y+1,n]$
$\overline{x}$	$\underline{c^{[1,o_x-1]}}$	0	$\underline{c^{[o_x+1,o_y-1]}}$	$c^{[o_y]}$	$\underline{c^{[o_y+1,n]}}$
y	$\underline{c^{[1,o_x-1]}}$	$\underline{c^{[o_x]}}$	$\underline{c^{[o_x+1,o_y-1]}}$	0	$\underline{c^{[o_y+1,n]}}$
$\overline{c}$	$c^{[1,o_x-1]}$	$c^{[o_x]}$	$c^{[o_x+1,o_y-1]}$	$c^{[o_y]}$	$c^{[o_y+1,n]}$

Table 2.1: Subvectors of x, y and c in case  $o_x < o_y$ . The underlined subvectors of x and y match their counterparts in c.

#### 2.3 General case

Having solved the trivial and prefix and suffix cases, we are left with the situation  $0^{\{n\}} < a < b < 1^{\{n\}}$ .

If a and b have the same MSB, we recursively span  $[a^{[2,n]}, b^{[2,n]}]$  and prepend the common MSB to the solution. This clearly preserves both feasibility and optimality.

Let us now consider the case when  $a^{[1]} \neq b^{[1]}$ . Since  $a \leq b$ , necessarily  $a^{[1]} = 0$  and  $b^{[1]} = 1$ . This restriction leaves us with four possible combinations of pairs of leading bits of a and b:

1. 
$$a^{[1,2]} = 01$$
.  $b^{[1,2]} = 10$ 

2. 
$$a^{[1,2]} = 00, b^{[1,2]} = 10$$

3. 
$$a^{[1,2]} = 01, b^{[1,2]} = 11$$

4. 
$$a^{[1,2]} = 00, b^{[1,2]} = 11$$

Following Schieber et al. [4], we will deal with each of these cases separately. Schieber et al.'s proofs of feasibility and optimality of the following algorithm are rather technical and out of scope of this text. Note, however, that the proof of optimality is implicitly based on building an orthogonal set of the same size as the computed spanning set.

We will denote  $a^{[3,n]}$  with  $\hat{a}$   $(a = a^{[1,2]}\hat{a})$  and  $b^{[3,n]}$  with  $\hat{b}$   $(b = b^{[1,2]}\hat{b})$ .

**2.3.1** 
$$a^{[1,2]} = 01$$
 and  $b^{[1,2]} = 10$ 

In this case we span the two sub-intervals  $[01\hat{a},011^{\{n-2\}}]$  and  $[100^{\{n-2\}},10\hat{b}]$  separately.

The endpoints of the sub-interval  $[01\hat{a}, 011^{\{n-2\}}]$  share the leading bit 0. This means that this sub-interval is immediately reduced to the suffix instance  $[1\hat{a}, 11^{\{n-2\}}]$ , which can be spanned using the suffix algorithm show in section 2.2.

The remaining sub-interval  $[100^{\{n-2\}}, 10\hat{b}]$  is reduced to a prefix interval  $[00^{\{n-2\}}, 0\hat{b}]$  in a similar fashion.

**2.3.2** 
$$a^{[1,2]} = 00$$
 and  $b^{[1,2]} = 10$ 

In this case, we divide the interval into three sub-intervals:

• 
$$[00\hat{a}, 001^{\{n-2\}}]$$

• 
$$[010^{\{n-2\}}, 011^{\{n-2\}}]$$

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•  $[100^{\{n-2\}}, 10\hat{b}]$ 

The sub-interval  $[010^{\{n-2\}}, 011^{\{n-2\}}]$  is spanned by the single ternary vector  $01\phi^{\{n-2\}}$ .

The sub-intervals  $[00\hat{a},001^{\{n-2\}}]$  and  $[100^{\{n-2\}},10\hat{b}]$  are spanned together as follows:

- 1. Recursively solve the (n-1)-bit instance  $[0\hat{a}, 1\hat{b}] = [a^{[1]}a^{[3,n]}, b^{[1]}b^{[3,n]}]$
- 2. Insert a 0-bit in the second position of the vectors from the resulting spanning set

Note that  $a^{[2]} = b^{[2]} = 0$ , so the *n*-bit vectors produced this way exactly span the union of the intervals  $[00\hat{a}, 001^{\{n-2\}}]$  and  $[100^{\{n-2\}}, 10\hat{b}]$ .

**2.3.3** 
$$a^{[1,2]} = 01$$
 and  $b^{[1,2]} = 11$ 

This case is complementary to case 2.3.2. As in suffix case, note that flipping all the bits in the endpoints transforms this case to case 2.3.2 and flipping the fixed bits in the resulting spanning set preserves correctness.

**2.3.4**  $a^{[1,2]} = 00$  and  $b^{[1,2]} = 11$ 

Let j be maximal such that  $a^{[1,j]} = 0^{\{j\}}$  and  $b^{[1,j]} = 1^{\{j\}}$ . Since  $a > 0^{\{n\}}$  (or  $b < 1^{\{n\}}$ ), necessarily j < n.

The number j gives us three sub-intervals to span:

- $[a, 0^{\{j\}}1^{\{n-j\}}]$
- $[0^{\{j-1\}}10^{\{n-j\}}, 1^{\{j-1\}}01^{\{n-j\}}]$
- $\bullet \ [1^{\{j\}}0^{\{n-j\}},b]$

Note that the second sub-interval contains exactly the numbers that don't start with either j zeros or j ones, and as such can be spanned by j ternary vectors. We construct  $T_1, \ldots, T_j$  that span the second sub-interval by appending  $\phi^{\{n-j\}}$  to each of the j cyclic shifts of  $01\phi^{\{j-2\}}$ . Thus,  $T_1 = 01\phi^{\{j-2\}}\phi^{\{n-j\}}, \ldots, T_i = \phi^{\{i-1\}}01\phi^{\{j-1-i\}}\phi^{\{n-j\}}$  (for  $i \in \{1, \ldots, j-1\}$ ),  $\ldots, T_{j-1} = \phi^{\{j-2\}}01\phi^{\{n-j\}}, T_j = 1\phi^{\{j-2\}}0\phi^{\{n-j\}}$ .

The other two sub-intervals are spanned recursively. Let  $a'' = a^{[j,n]}$  and  $b'' = b^{[j,n]}$ . Note that  $a''^{[1]} = 0$  and  $b''^{[1]} = 1$ . Note that |a''| = |b''| = n - j + 1. Since  $j \ge 2$ , n - j + 1 < n. Let  $\mathcal{T}''$  be the spanning set of [a'', b''] computed recursively.

The spanning set of [a, b] will be computed from the vectors  $T_1, \ldots, T_j$  and  $\mathcal{T}''$  based on the relation between (n-j)-bit suffixes of a and b. Let  $a' = a^{[j+1,n]}$  and  $b' = b^{[j+1,n]}$ .

b' < a' - 1

In this case, the spanning set of [a, b] consists of the vectors  $T_1, \ldots, T_j$  and vectors obtained by prepending each vector from  $\mathcal{T}''$  with  $\phi^{\{j-1\}}$ .

$$b' \le a' - 1$$

In this case, the spanning set of [a, b] consists of the vectors  $T_1, \ldots, T_{j-1}$  (omitting  $T_j$ ) and a set  $\mathcal{T}'$  which is derived from  $\mathcal{T}''$  in the following way:

$$\mathcal{T}' = \{ \phi^{\{j-1\}} T | T \in \mathcal{T}'' \text{ and } T^{[1]} \in \{0, \phi\} \}$$
$$\cup \{ 1\phi^{\{j-1\}} T^{[2, n-j+1]} | T \in \mathcal{T}'' \text{ and } T^{[1]} = 1 \}$$

# 3. 2-interval functions

In this chapter we will revise the results specific to 2-interval functions. Dubovský [1] provides more detailed overview.

Dubovský identified several classes of 2-interval functions [1, p. 5] which seem to require different approaches to spanning. It turns out that it is useful to consider the number of so-called switches to differentiate between these classes. The concept of switch was introduced by Hušek [2, 3].<sup>1</sup>

Reword "seem to require".

¿ Move definition to Definitions if the term is used in any chapter except 2interval.

¿ Add "Equivalently, a kinterval function is [?]switch in case
..."

**Definition 3.0.1** (*l*-switch function). A Boolean function f is l-switch if and only if there are exactly l input vectors x such that  $f(x) \neq f(x+1)$ .

It is easy to see that prefix and suffix interval functions are 1-switch.

Depending on f(0), an l-switch Boolean function f is proper  $\lceil \frac{l}{2} \rceil$ -interval in case f(0) = 0, or proper  $\lceil \frac{l+1}{2} \rceil$ -interval in case f(0) = 1.

Namely, a 2-switch Boolean function such that f(0) = 0 is 1-interval.

#### 3.1 2-switch functions

Let f be a 2-interval 2-switch Boolean function (necessarily  $f(0^{\{n\}}) = f(1^{\{n\}}) = 1$ ). We will show that f can be optimally spanned by reduction to a 2-switch 1-interval Boolean function f' of at most the same arity, which can be spanned using the algorithm introduced in chapter 2.

Note that Dubovský introduced an optimization algorithm for this class of functions [1, section 3.2], following an argument similar to the one used by Schieber et al. to span 1-interval functions [4]. However, the reduction approach gives an interesting insight in the problem and appears easier to describe.

From the definition of f we know that it is 2-interval with the outer interval endpoints being  $0^{\{n\}}$  and  $1^{\{n\}}$ :

$$f = f_{[0^{\{n\}},b_1],[a_2,1^{\{n\}}]}^n$$

Let's call the inner interval endpoints  $b_1$  and  $a_2$ .  $0^{\{n\}} \le b_1$ ,  $b_1 < a_2 - 1$  (f is proper 2-interval – otherwise it would be a tautology and thus trivial to span),  $a_2 \le 1^{\{n\}}$ .

**3.1.1** 
$$b_1^{[1]} = a_2^{[1]}$$

In case  $b_1$  and  $a_2$  have the same MSBs, we recursively solve the (n-1)-bit case  $[0^{\{n-1\}}, b_1^{[2,n]}], [a_2^{[2,n]}, 1^{\{n-1\}}]$ , and add an extra ternary vector to span the remainder of the true points.

Without loss of generality, let  $b_1^{[1]} = a_2^{[1]} = 0$ . The complementary case is symmetric.

Let  $b'_1 = b_1^{[2,n]}$  and  $a'_2 = a_2^{[2,n]}$ . Let  $\mathcal{T}'_0$  be an optimal spanning set of  $f' = f_{[0^{\{n-1\}},b'_1],[a'_2,1^{\{n-1\}}]}^{n-1}$ . Note that f' is of the same type (that is 2-interval 2-switch)

<sup>&</sup>lt;sup>1</sup> Hušek first used the Czech term "zlom" in his thesis [2, p. 13] and later translated the term as "switch" in personal communication [3].

<sup>&</sup>lt;sup>2</sup>This corresponds to class  $A_0$  in Dubovský's classification [1, p. 5].

and has a lower arity, so we can span it by recursion. Let  $\mathcal{T}_0$  be the *n*-bit set we get by prepending the symbol 0 to each vector from  $\mathcal{T}'_0$  ( $\mathcal{T}_0 = \{0T | T \in \mathcal{T}'_0\}$ ). Let  $\mathcal{T}_1 = \{1\phi^{\{n-1\}}\}$ . Let  $\mathcal{T} = \mathcal{T}_0 \cup \mathcal{T}_1$ . We claim that  $\mathcal{T}$  spans exactly  $f^n_{[0^{\{n\}},b_1],[a_2,1^{\{n\}}]}$  and that  $\mathcal{T}$  is minimum such.

**Theorem 3.1.1.1.**  $\mathcal{T}$  spans exactly  $f_{[0^{\{n\}},b_1],[a_2,1^{\{n\}}]}^n$  (feasibility).

Proof.

1.  $span(\mathcal{T}) \subseteq TP(f)$ 

Let  $c \in span(T)$ ,  $T \in \mathcal{T}$ . We need to show that  $c \leq b_1$  or  $c \geq a_2$ .

- (a)  $c^{[1]} = 1$ : Since  $a_2^{[1]} = 0$ , necessarily  $c \ge a_2$ .
- (b)  $c^{[1]} = 0$ : Necessarily  $T \in \mathcal{T}_0$ . Let  $T' = T^{[2,n]}$  and  $c' = c^{[2,n]}$ . Since T spans c, T' spans c'. By construction of  $\mathcal{T}_0$  necessarily  $T' \in \mathcal{T}_0'$ , so T' does not span any number in  $[b'_1 + 1, a'_2 1]$ . Thus  $c' \leq b'_1$  or  $c' \geq a'_2$ . Observe that prepending a 0 bit to c',  $b'_1$  and  $a'_2$  preserves the inequalities:

$$c' \leq b'_1$$
 or  $c' \geq a'_2 \Rightarrow 0c' \leq 0b'_1$  or  $0c' \geq 0a'_2$ 

Since 0c' = c, 0a' = a and 0b' = b, we get  $c \le b_1$  or  $c \ge a_2$ .

2.  $TP(f) \subseteq span(\mathcal{T})$ 

Let  $c \leq b_1$  or  $c \geq a_2$ . We need a  $T \in \mathcal{T}$  that spans c.

- (a)  $c^{[1]} = 1$ :  $1\phi^{n-1} \in \mathcal{T}_1 \subseteq \mathcal{T}$  spans c.
- (b)  $c^{[1]} = 0$ : Similarly to  $b'_1$  and  $a'_2$ , let  $c' = c^{[2,n]}$ . Since  $b_1$ ,  $a_2$  and c all start with a 0 bit,  $c' \le b'_1$  or  $c' \ge a'_2$ . Since  $\mathcal{T}'_0$  spans  $f^{n-1}_{[0^{\{n-1\}},b'_1],[a'_2,1^{\{n-1\}}]}$ , there is  $T \in \mathcal{T}'_0$  that spans c'. Prepending the symbol 0 to both T and c' preserves spanning, so  $0T \in \mathcal{T}_0 \subseteq \mathcal{T}$  spans c.

**Theorem 3.1.1.2.**  $\mathcal{T}$  is a minimum spanning set of  $f_{[0^{\{n\}},b_1],[a_2,1^{\{n\}}]}^n$  (optimality).

*Proof.* Let  $\mathcal{T}_{opt}$  be an optimal spanning set of  $f_{[0^{\{n\}},b_1],[a_2,1^{\{n\}}]}^n$ . We'll show that  $|\mathcal{T}_{opt}| \geq |\mathcal{T}|$ .

First recall that  $\mathcal{T}'_0$  is an optimal spanning set of  $f_{[0^{\{n-1\}},b'_1],[a'_2,1^{\{n-1\}}]}^{n-1}$  and  $|\mathcal{T}| = |\mathcal{T}'_0| + 1$ . Thus we need to show  $|\mathcal{T}_{opt}| \geq |\mathcal{T}'_0| + 1$ 

 $\mathcal{T}_{opt}$  must span the true point  $\bar{b}_1 = 1(b_1+1)^{[2,n]}$  (since  $a_2$  starts with a 0, all numbers that start with a 1 must be true points). We don't need more than n bits for  $\bar{b}_1$  because  $b_1 < a_2 \le 01^{\{n-1\}}$ . Let  $T_{\bar{b}_1} \in \mathcal{T}_{opt}$  be a ternary vector that spans  $\bar{b}_1$ . If  $T_{\bar{b}_1}$  spanned any vector that starts with a 0, then  $T_{\bar{b}_1}$  would also span the vector  $b_1 + 1$ . However, since f is proper 2-interval,  $b_1 + 1$  is a false point  $(b_1 < b_1 + 1 < a_2)$ . So  $T_{\bar{b}_1}$  can't span any vector that starts with a 0.

To get a contradiction, let's suppose that  $|\mathcal{T}_{opt}| \leq |\mathcal{T}'_0|$ . Since we need a dedicated vector  $T_{\bar{b}_1} \in \mathcal{T}_{opt}$  to span  $\bar{b}_1$ , there are at most  $|\mathcal{T}_{opt}| - 1 \leq |\mathcal{T}'_0| - 1$  vectors in  $\mathcal{T}_{opt}$  that span a number that starts with 0 (so these vectors start with

0 or  $\phi$ ). Removing the first symbol of these vectors, we get a spanning set of  $f_{[0^{\{n-1\}},b'_1],[a'_2,1^{\{n-1\}}]}^{n-1}$  of size at most  $|\mathcal{T}'_0| - 1$ , which contradicts  $\mathcal{T}'_0$ 's optimality.

We conclude that we need at least  $|\mathcal{T}_0'| + 1$  vectors to span  $f_{[0^{\{n\}},b_1],[a_2,1^{\{n\}}]}^n$ , proving the lower bound of  $|\mathcal{T}_{opt}|$  and the optimality of  $\mathcal{T}$ .

#### ¿ Note that the proof could be rephrased using orthogonal sets explicitly.

We have shown that in case  $b_1^{[1]} = a_2^{[1]}$ , our algorithm produces a feasible and optimal spanning set.

**3.1.2** 
$$b_1^{[1]} \neq a_2^{[1]}$$

Let  $b_1^{[1]} \neq a_2^{[1]}$ . Since  $b_1 \leq a_2$ , necessarily  $b_1^{[1]} = 0$  and  $a_2^{[1]} = 1$ .

By flipping the leading bit in each of the endpoints  $b_1$  and  $a_2$ , we will reduce this case to an instance of spanning a single true point interval on n bits.

Let  $b'_1 = 1b_1^{[2,n]}$  and  $a'_2 = 0a_2^{[2,n]}$  (flipping the leading bits of  $b_1$  and  $a_2$ ). Note that  $a'_2 \leq b'_1$ .

Let  $\mathcal{T}'$  be a minimum spanning set of  $f_{[a'_2,b'_1]}^n$ . This set can be computed efficiently using the method shown in chapter 2.

Let's flip all the non- $\phi$  leading symbols of vectors in  $\mathcal{T}'$ , forming  $\mathcal{T}$ . Note that  $|\mathcal{T}| = |\mathcal{T}'|$  and also that all the vectors in  $\mathcal{T}'$  and  $\mathcal{T}$  have the length n.

We claim that  $\mathcal{T}$  is a minimum spanning set of  $f_{[0^{\{n\}},b_1],[a_2,1^{\{n\}}]}^n$ .

The argument is based on a pair of lemmas.

**Lemma 3.1.2.1.** Let c be an n-bit binary vector and a,b be (n-1)-bit binary vectors. Let  $c' = \overline{c^{[1]}} c^{[2,n]}$  (flipping the leading bit of c). Then  $(c \le 0b \text{ or } c \ge 1a)$  if and only if  $(c' \ge 0a \text{ and } c' \le 1b)$ .

Proof.

1.  $c^{[1]} = 0$ :

Let  $c = 0c^{[2,n]}$  and  $c' = 1c^{[2,n]}$ .

Since  $c^{[1]} = 0$ ,  $c \ngeq 1a$ . Thus  $(c \le 0b \text{ or } c \ge 1a)$  if and only if  $c \le 0b$ .

Since  $c^{[1]} = 0$ , c < 0b if and only if  $c^{[2,n]} < b$ .

Since  $c'^{[1]} = 1$  and  $c'^{[2,n]} = c^{[2,n]}$ ,  $c^{[2,n]} \le b$  if and only if  $c' \le 1b$ .

From  $c'^{[1]} = 1$  we immediately get  $c' \geq 0a$ .

Chaining the equivalences together:

$$c \le 0b \text{ or } c \ge 1a \iff c \le 0b$$

$$\iff c^{[2,n]} \le b$$

$$\iff c' \le 1b$$

$$\iff c' \le 1b \text{ and } c' \ge 0a$$

2.  $c^{[1]} = 1$ :

This case is symmetric to the previous one.

**Lemma 3.1.2.2.** Let  $\mathcal{T}$  be a set of ternary vectors and  $\mathcal{T}' = \{\overline{T^{[1]}}T^{[2,n]}|T \in \mathcal{T}\}.$ Let a, b be any (n-1)-bit binary vectors. Then  $\mathcal{T}$  spans  $f_{[0^{\{n\}},0b],[1a,1^{\{n\}}]}^n$  if and only if  $\mathcal{T}'$  spans  $f_{[0a,1b]}^n$ .

Proof.

1. If  $\mathcal{T}$  spans  $f_{[0^{\{n\}},0b],[1a,1^{\{n\}}]}^n$ , then  $\mathcal{T}'$  spans  $f_{[0a,1b]}^n$ :

Let  $\mathcal{T}$  span  $f_{[0^{\{n\}},0b],[1a,1^{\{n\}}]}^n$ .

Let c' be an n-bit binary vector. We need to show that  $\mathcal{T}'$  spans c' if and only if  $c' \geq 0a$  and  $c' \leq 1b$ .

Let  $c = \overline{c'^{[1]}} c'^{[2,n]}$ . By definition of  $\mathcal{T}'$ ,  $\mathcal{T}'$  spans c' if and only if  $\mathcal{T}$  spans c.

Since  $\mathcal{T}$  spans  $f_{[0^{\{n\}},0b],[1a,1^{\{n\}}]}^n$ ,  $\mathcal{T}$  spans c if and only if  $c \leq 0b$  or  $c \geq 1a$ .

From Lemma 3.1.2.1 we get  $(c \le 0b \text{ or } c \ge 1a)$  if and only if  $(c' \ge 0a \text{ and } c' \ge 0a)$  $c' \leq 1b$ ).

Chaining the equivalences together:

$$\mathcal{T}'$$
 spans  $c' \iff \mathcal{T}$  spans  $c$ 

$$\iff c \le 0b \text{ or } c \ge 1a$$

$$\iff c' \ge 0a \text{ and } c' \le 1b$$

$$\iff f_{[0a,1b]}^n(c') = 1$$

2. If  $\mathcal{T}'$  spans  $f^n_{[0a,1b]}$ , then  $\mathcal{T}$  spans  $f^n_{[0^{\{n\}},0b],[1a,1^{\{n\}}]}$ :

Let  $\mathcal{T}'$  span  $f_{[0a,1b]}^n$ .

Let c be an n-bit binary vector. We need to show that  $\mathcal{T}$  spans c if and only if c < 0b or c > 1a.

Let  $c' = \overline{c^{[1]}} c^{[2,n]}$ . By definition of  $\mathcal{T}'$ ,  $\mathcal{T}$  spans c if and only if  $\mathcal{T}'$  spans c'.

Since  $\mathcal{T}'$  spans  $f_{[0a,1b]}^n$ ,  $\mathcal{T}'$  spans c' if and only if  $c' \geq 0a$  and  $c' \leq 1b$ .

Using Lemma 3.1.2.1, we get  $(c' \ge 0a \text{ and } c' \le 1b)$  if and only if  $(c \le 0b \text{ or } a)$  $c \geq 1a$ ).

Chaining the equivalences together:

$$\mathcal{T}$$
 spans  $c\iff \mathcal{T}'$  spans  $c'$ 
 $\iff c' \geq 0a \text{ and } c' \leq 1b$ 
 $\iff c \leq 0b \text{ or } c \geq 1a$ 
 $\iff f_{[0^{\{n\}},0b],[1a,1^{\{n\}}]}^n(c) = 1$ 

¿ Consider Lemma 3.1.2.2 shows a size preserving bijection between the spanning sets of functions of form  $f_{[0^{\{n\}},0b],[1a,1^{\{n\}}]}^n$  and  $f_{[0a,1b]}^n$  for general a and b. Since  $b_1$  starts with a 0  $(b_1 = 0b)$ ,  $a_2$  starts with a 1  $(a_2 = 1a)$  and the set  $\mathcal{T}$  was constructed from

rewording, e.g. "one-toone correspondence" or "correspondence".

<sup>&</sup>lt;sup>3</sup>Note that the statement holds even in the single case that the function is not proper 2interval, that is  $a = 1^{\{n-1\}}$  and  $b = 0^{\{n-1\}}$ .

an optimal spanning set  $\mathcal{T}'$  of  $f_{[0a_2^{[2,n]},1b_1^{[2,n]}]}^n$  using the bijection shown in 3.1.2.2, that is flipping the leading symbols of all the ternary vectors, both feasibility and optimality of  $\mathcal{T}$  with respect to  $f_{[0^{\{n\}},b_1],[a_2,1^{\{n\}}]}^n$  follow from the feasibility and optimality of  $\mathcal{T}'$  with respect to  $f_{[0a_2^{[2,n]},1b_1^{[2,n]}]}^n$ .

#### 3.2 3-switch functions

The situation changes in 3-switch functions. In 1-switch (prefix and suffix) and 2-switch (1-interval and 2-interval with extreme outer endpoints) functions, we managed to efficiently find minimum spanning sets. The proofs of optimality of the spanning sets depend on construction of sufficiently large orthogonal sets.<sup>4</sup> Doing so, we depended on *coverability* of the functions in question.

Dubovský has identified a 3-switch function whose maximum orthogonal set is strictly smaller than its minimum spanning set. The function is  $f_{[0,4],[9,14]}^4$ . The size of its maximum orthogonal set is 4 and the size of its minimum spanning set is 5.[1, p. 32] Dubovský proved the bounds on sizes of orthogonal sets and spanning sets by exhaustion using software tools.

This result shows that 3-switch functions are not coverable in general.

We will generalize the result for functions with larger number of switches.

**Lemma 3.2.0.3.** If there is an l-switch function that is not coverable, then there is also an (l+1)-switch function that is not coverable.

*Proof.* Let f be an n-ary l-switch function that is not coverable.

1.  $f(1^{\{n\}}) = 1$ :

Let f' be an (n+1)-ary function defined in the following way:

$$f'(x') = \begin{cases} f(x'^{[2,n+1]}) & \text{if } x'^{[1]} = 0\\ 0 & \text{if } x'^{[1]} = 1 \end{cases}$$

Since f is l-switch, there are exactly l vectors x of length n ( $x < 1^{\{n\}}$ ) such that  $f(x) \neq f(x+1)$ . Prepending a 0 to each of these vectors, we get l vectors x' of length n+1 such that  $f'(x') \neq f'(x'+1)$ . The (l+1)-st "switch" vector of f' is  $01^{\{n\}}$ , since  $f'(01^{\{n\}}) = 1$  and  $f'(10^{\{n\}}) = 0$ . Thus we have shown that f' is (l+1)-switch.

It is easy to see that there is a size preserving 1-1 correspondence between the spanning sets of f and f'. The same holds for orthogonal sets. This proves that if f is not coverable, neither is f'.

2.  $f(1^{\{n\}}) = 0$ :

Let f' be an (n+1)-ary function defined in the following way:

Prove that f' doesn't have more switch vectors.

¿ Elaborate.

<sup>&</sup>lt;sup>4</sup>While we have only shown an orthogonal set explicitly in the case of prefix interval (subsection 2.2.2), the other cases use orthogonal sets implicitly, both in [4] and section 3.1.

$$f'(x') = \begin{cases} f(x'^{[2,n+1]}) & \text{if } x'^{[1]} = 0\\ 0 & \text{if } x' \in [10^{\{n\}}, 1^{\{n\}}0]\\ 1 & \text{if } x' = 1^{\{n+1\}} \end{cases}$$

Note that with Kucera on 15 April 2015, we found it necessary for f to also have the false point  $1^{\{n-1\}}0$  for the procedure to work. I believe that the proof also works in the other case as well.

Again, the l switches of f translate to l switches of f' by prepending a 0. The (l+1)-st switch is  $1^{\{n\}}0$  in this case.

 $dnf(f') \ge dnf(f) + 1$  We need a special ternary vector to span the true point  $1^{\{n+1\}}$  in f'. If a ternary vector spanned both  $1^{\{n+1\}}$  and 0x, it would necessarily also span the false point  $01^{\{n\}}$ .

If we could span f' with less than dnf(f) + 1 vectors, we could span f with less than dnf(f) vectors, since given a spanning set of f', leaving out the vector that spans the true point  $1^{\{n+1\}}$  and removing the leading symbol of the rest (necessarily a 0) gives a spanning set of f.

 $\operatorname{ortho}(f') \leq \operatorname{ortho}(f) + 1$  To get a contradiction, let V' be an orthogonal set of f' of size  $\operatorname{ortho}(f) + 2$ . Let  $V = \{v'^{[2,n+1]}|v' \in V' \text{ and } v'^{[1]} = 0\}$ . Since V' only consists of true points of f', there can be at most one vector in V' that starts with a 1. It follows that  $|V| \geq |V'| - 1 = \operatorname{ortho}(f) + 1$ . V is an orthogonal set of f – if 0u and 0v are orthogonal in f', every ternary vector that spans them must span a false point 0x. Leaving out the leading symbol preserves the relation, and thus orthogonality as well. We have shown an orthogonal set of f of size at least  $\operatorname{ortho}(f) + 1$ , which contradicts the premise that  $\operatorname{ortho}(f)$  is the size of a maximum orthogonal set of f.

Putting the inequalities together:

$$ortho(f') \le ortho(f) + 1 < dnf(f) + 1 = dnf(f')$$

We conclude that f' is an (l+1)-switch non-coverable function.

We conclude with the following theorem:

**Theorem 3.2.0.1.** For any  $l \geq 3$ , there is an l-switch non-coverable function. Moreover, the arity of such function can be as small as l + 1.

This result indicates that minimizing the DNF representation of functions that have at least 3 switches requires a different approach for proving optimality.

Review.

20

# 4. 2k-approximation algorithm for minimizing DNF representation of k-interval Boolean functions

#### Put the chapter in the context of the preceding chapters.

In this chapter, an algorithm will be shown that computes a small spanning set of any k-interval Boolean function. The input intervals are represented by pairs of endpoints (n-bit numbers). An approximation ratio of 2k will be proved.

We will only consider proper k-interval Boolean functions, that is those whose adjacent intervals are separated by at least one false point (see Definition 1.7.2). A k-interval Boolean function which is not proper k-interval can be efficiently reduced to a proper l-interval where l < k by joining the touching adjacent intervals.

#### 4.1 Algorithm

#### 4.1.1 Description

**Input** Numbers  $a_1, b_1, \ldots, a_k, b_k$  such that  $0^{\{n\}} \le a_1, a_1 \le b_1, b_1 < a_2 - 1, \ldots, a_i \le b_i, b_i < a_{i+1} - 1$  (for  $i \in \{1, \ldots, k-1\}$ ),  $\ldots, b_{k-1} < a_k - 1, a_k \le b_k, b_k \le 1^{\{n\}}$ .

Output A set of ternary vectors

**Procedure** The algorithm goes through all the intervals  $[a_i, b_i]$ . For each i, the longest common prefix of  $a_i$  and  $b_i$  is computed. Let j be its length. Note that  $a^{[j+1]} = 0$  and  $b^{[j+1]} = 1$ . Now let  $a'' = a_i^{[j+2,n]}$  and  $b'' = b_i^{[j+2,n]}$ . Optimally span the suffix interval  $[a'', 1^{n-j-1}]$  and the prefix interval  $[0^{n-j-1}, b'']$  using the (linear time) algorithm introduced in Section 2.2. Prepend  $a_i^{[1,j+1]}$  and  $b_i^{[1,j+1]}$  to the respective ternary vectors and add them to the output spanning set.

Treat (explicitly) the degenerate cases:  $a_1 = 0$ ,  $b_k = 2^n - 1$ , j = n, j = n - 1.

#### 4.1.2 Feasibility

**Theorem 4.1.2.1.** The algorithm spans exactly  $f_{[a_1,b_1],\dots,[a_k,b_k]}^n$ .

*Proof.* This is easy to see from the fact that the intervals  $[a_i, b_i]$  form a partition of the true point set and that each of them is spanned exactly by the suffix and prefix procedure.

Go into more detail.

#### 4.1.3 Approximation ratio

**Theorem 4.1.3.1.** Let  $\mathcal{T}_{opt}$  be an optimal spanning set of  $f_{[a_1,b_1],...,[a_k,b_k]}^n$  and let  $\mathcal{T}_{approx}$  be the spanning set returned by the algorithm. We claim that:

$$|\mathcal{T}_{approx}| \le 2k|\mathcal{T}_{opt}|$$

Clarify: the interval is prefix or suffix on n - j - 1 bits, but not in general on n bits.

*Proof.* Let  $\mathcal{T}_x$  be the largest (n-bit) spanning set of a "suffix" or "prefix" subinterval added in the algorithm. Without loss of generality, let the respective subinterval be "prefix"  $[b_i^{[1,j+1]}0^{\{n-j-1\}},b_i]$ . From Section 2.2 we know that there is an orthogonal set of  $[b_i^{[1,j+1]}0^{\{n-j-1\}},b_i]$  of size  $|\mathcal{T}_x|$ , and moreover that its orthogonality only depends on the false point  $b_i+1$ . Note, however, that  $b_i+1$  is also a false point in  $f_{[a_1,b_1],\dots,[a_k,b_k]}^n$  since  $b_i< a_{i+1}-1$ . Thus we obtain an orthogonal set of size  $|\mathcal{T}_x|$  for the k-interval function, limiting the size of its optimal spanning set  $|\mathcal{T}_{opt}| \geq |\mathcal{T}_x|$  by Theorem 1.6.0.1.

Since  $\mathcal{T}_x$  is the largest of the 2k partial sets used to span the function in the approximation algorithm, we know that  $|\mathcal{T}_{approx}| \leq 2k|\mathcal{T}_x|$ .

Joining the inequalities together we conclude:

$$|\mathcal{T}_{approx}| \le 2k|\mathcal{T}_x| \le 2k|\mathcal{T}_{opt}|$$

Note that the spanning set returned by the algorithm is disjoint. This makes the algorithm 2k-approximation for the disjoint case as well:

**Theorem 4.1.3.2.** Let  $\mathcal{T}_{disjoint}$  be an optimal disjoint spanning set of  $f_{[a_1,b_1],...,[a_k,b_k]}^n$  and let  $\mathcal{T}_{approx}$  be the (disjoint) spanning set returned by our algorithm. We claim that:

$$|\mathcal{T}_{approx}| \le 2k|\mathcal{T}_{disjoint}|$$

*Proof.* Since every disjoint spanning set is a spanning set in general,  $|\mathcal{T}_{disjoint}| \ge |\mathcal{T}_{opt}|$ , where  $\mathcal{T}_{opt}$  is an optimal (not necessarily disjoint) spanning set of  $f_{[a_1,b_1],...,[a_k,b_k]}^n$ . Using Theorem 4.1.3.1 we get:

$$|\mathcal{T}_{approx}| \le 2k|\mathcal{T}_{opt}| \le k|\mathcal{T}_{disjoint}|$$

**Theorem 4.1.3.3.** The approximation ratio of 2k is tight.

*Proof.* For every k that is a power of 2 we'll show a k-interval function such that  $|\mathcal{T}_{approx}| = 2k|\mathcal{T}_{opt}|$  (following the notation from Theorem 4.1.3.1).

Let  $k = 2^{n_k}$ . Let P be all the  $n_k$ -bit numbers, that is  $P = \{0, 1\}^{n_k}$ . Note that  $|P| = 2^{n_k} = k$ .

For each  $p \in P$ , we define the interval  $[a_p, b_p]$  by appending 2-bit suffixes to p:

- $a_p = p00$
- $b_p = p01$

The first appended bit (0 for both  $a_p$  and  $b_p$ ) ensures that there is at least one false point between any pair of intervals defined this way (all the points that have 1 in their  $(n_k + 1)$ -st component are false points). The second appended bit (0 for  $a_p$  and 1 for  $b_p$ ) ensures that the interval has two points, so the approximation algorithm will use two vectors to span it. Thus we have k intervals on  $(n_k + 2)$ -bit numbers, none of which intersect or touch.

Since  $P = \{0, 1\}^{n_k}$ , we can span all the intervals by the single ternary vector  $\phi^{\{n_k\}}0\phi$ . Clearly  $|\mathcal{T}_{opt}| = 1$ .

However, the approximation algorithm uses 2k vectors to span the intervals, since it spans each of the intervals separately and uses two vectors for each interval.

We get  $|\mathcal{T}_{approx}| = 2k|\mathcal{T}_{opt}|$ .

Note that the optimal spanning set is disjoint, so the ratio is tight in disjoint case as well.  $\Box$ 

# 5. Better approximation is hard

¿ Leave the chapter out, since the result is not very interesting and the proof is quite complicated. Or give just a sketch of the proof.

¿ Use a better chapter title.

#### Finish the chapter.

Dubovský has shown a 2-approximation algorithm for spanning general 2-interval functions (including 3-switch and 4-switch).[1, p. 33] The algorithm simply spans each of the two intervals separately optimally and then returns the union of these partial spanning sets. A natural generalization of this algorithm to k-interval functions spans each of the k intervals separately optimally. It's easy to see that this algorithm performs at least as well as the 2k-approximation algorithm shown in chapter 4. We'll show, however, that for a large k, the approximation ratio of the improved algorithm converges to 2k.

Consider rewording.

In order to do this, we will construct a class of "hard" multi-interval Boolean functions.

#### 5.1 Approximation-hard functions

Let  $l \ge 1$  denote the length of the interval prefix. Then  $k = 2^{l-1} + 1$  is the number of intervals of the multi-interval function we construct. Let  $n \ge l + 2$  be the target function arity. We will construct a proper k-interval n-ary function that consists of 2 short intervals and  $2^{l-1} - 1$  long intervals.

The short intervals reside in the subtrees associated with the prefixes  $0^{\{l\}}$  and  $1^{\{l\}}$ :

- $[a_1, b_1] = [0^{\{l\}} \ 0^{\{n-l-1\}} 1, 0^{\{l\}} \ 1^{\{n-l-1\}} 0]$
- $[a_k, b_k] = [1^{\{l\}} 0^{\{n-l-1\}} 1, 1^{\{l\}} 1^{\{n-l-1\}} 0]$

The long intervals reside in the remaining subtrees and each of them intersects two of them:

- $\bullet \ [a_2,b_2] = [0^{\{l-2\}}01 \ 0^{\{n-l-1\}}1, 0^{\{l-2\}}10 \ 1^{\{n-l-1\}}0]$
- $[a_3, b_3] = [0^{\{l-3\}}011\ 0^{\{n-l-1\}}1, 0^{\{l-3\}}100\ 1^{\{n-l-1\}}0]$

Typeset bet-

ter; esp. don't show the bullet here.

•  $[a_{k-1}, b_{k-1}] = [1^{\{l-2\}}01\ 0^{\{n-l-1\}}1, 1^{\{l-2\}}10\ 1^{\{n-l-1\}}0]$ 

In other words, for  $i \in \{2, \ldots, k-1 = 2^{l-1}\}$ , the prefix of the endpoint  $a_i$ , denoted  $p_i$ , is the l-bit number 2(i-2)+1 (note that  $p_i$ s exhaust all the odd numbers between  $1=0^{\{l-2\}}$  01 and  $2^l-3=1^{\{l-2\}}$  01). Using  $p_i$  we get the endpoints of the i-th interval:

• 
$$a_i = (p_i \ 0^{\{n-l-1\}}1)$$

• 
$$b_i = ((p_i + 1) \ 1^{\{n-l-1\}}0)$$

Really?

Insert the

number here.

Note that  $a_i$  for every i ends with the suffix  $0^{\{n-l-1\}}1$  ( $a_i^{[l+1,n]} = 0^{\{n-l-1\}}1$ ) and  $b_i$  always ends with the suffix  $1^{\{n-l-1\}}0$ . The l-bit prefixes of  $a_i$  and  $b_i$  are either equal in case  $i \in \{1, k\}$ , or successive numbers in case  $i \in \{2, \ldots, k-1\}$ .

We claim that  $f = f_{[a_1,b_1],...,[a_k,b_k]}^n$  can be spanned with as few as n ternary vectors, while the approximation algorithm produces a spanning set of size [?].

**Lemma 5.1.0.1**  $(dnf(f) \leq n)$ . The function  $f_{[a_1,b_1],...,[a_k,b_k]}^n$  defined above can be spanned with as few as n vectors.

*Proof.* First observe that f has a limited number of false points, as each pair of successive intervals is separated by just two false points and there are just two false points which do not lie between the intervals (they are the two extreme outer points  $0^{\{n\}}$  and  $1^{\{n\}}$ ). There are 2k false points in total, each of them being either  $a_i - 1$  or  $b_i + 1$  for some i.

To span f, we first span the intervals  $[j \ 0^{\{n-l-1\}}1, j \ 1^{\{n-l-1\}}0]$  for every  $j \in \{0,1\}^l$ . The set  $\mathcal{T}_{in} = \{\phi^l \ s | s \text{ is a cyclic shift of } 01\phi^{n-l-2}\}$  exactly spans the union of the intervals  $[j \ 0^{\{n-l-1\}}1, j \ 1^{\{n-l-1\}}0]$ . To see that it actually does, observe that for every j, we want to span all the vectors with prefix j except the two vectors  $(j \ 0^{\{n-l\}})$  and  $(j \ 1^{\{n-l\}})$ . The cyclic shifts of  $01\phi^{n-l-2}$  span exactly all the numbers with the exception of  $0^{\{n-l\}}$  and  $1^{\{n-l\}}$ , since every number that contains both a 0 and a 1 has some position i such that  $x^{[i]} = 0$  and  $x^{[(i+1) \mod (n-l)]} = 1$ . The size of  $\mathcal{T}_{in}$  is clearly n-l.

We are left with two true points to span in each of the long intervals. There are  $k-2=2^{l-1}-1$  long intervals. Spanning each of the remaining true points separately, we get  $\mathcal{T}_{out}$  of size  $2(k-2)=2(2^{l-1}-1)=2^l-2$ .

Use a better algorithm – one that produces merely n + l - 2 vectors.

$$\lim_{n \to \infty} \frac{|\mathcal{T}_{approx}|}{|\mathcal{T}|} = 2^l$$

$$\lim_{l \to \infty} \frac{\lim_{n \to \infty} \frac{|\mathcal{T}_{approx}|}{|\mathcal{T}|}}{k} = 2$$

Finish.

# Conclusion

We have shown that with respect to finding a minimum DNF representation, 2-switch 2-interval functions can be reduced to 1-interval functions.

Then we showed that for every  $l \geq 3$ , there is an l-switch function that is not coverable, extending Dubovský's result about 3-switch functions. This suggests that possible future algorithms that optimally span multi-interval functions are going to require a different approach for proving optimality.

To remedy the difficulty with spanning multi-interval functions, we introduced a 2k-approximation algorithm for minimizing DNF representations of k-interval functions. The algorithm naturally extends Schieber et al.'s suffix-prefix approximation algorithm for disjoint spanning sets of 1-interval functions [4, section 6]. Our algorithm produces disjoint spanning sets and has the approximation ratio of 2k for the problem of finding a minimum disjoint representation as well.

Some interesting questions are still left to be answered regarding multi-interval Boolean functions. Since general Boolean minimization is  $\Sigma_2^p$ -hard [5], there must be some k such that minimization of k-interval functions is  $\Sigma_2^p$ -hard, and a k' for which minimization is NP-hard. Schieber et al. showed that such k' > 1, which is the only bound shown so far. There is a substantial difference between 1- and 2-interval functions since the former are coverable in general, while the latter are not. This prevents us from using a similar approach to minimizing 2-interval functions. I suspect this difference could correspond to a difference in computational complexity of the problem.

The 2k-approximation algorithm presented in this thesis is constructed so that we can use the orthogonal sets for proving the approximation ratio. There may be a better approximation algorithm for k-interval functions and searching for it could provide an interesting insight in proving lower bounds for minimum DNF representation size of the functions in question.

Cite in section 2kapprox as well.

Really? Probably yes; note that we can translate a k-interval function in a spanning set of size 2kn.

Is it a good idea to "suspect" in a thesis?

¿ Suspect more explicitly, e.g. 3switch functions are NPhard.

We may have shown a better one in betterapprox

# **Bibliography**

- [1] Jakub Dubovský. A construction of minimum DNF representations of 2-interval functions. Master's thesis, Charles University in Prague, 2012. URL https://is.cuni.cz/webapps/zzp/detail/116613/.
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- [6] Ondřej Čepek, Petr Kučera, and Petr Savický. Boolean functions with a simple certificate for CNF complexity. *Discrete Applied Mathematics*, 160(4-5):365-382, 2012. ISSN 0166-218X. doi: http://dx.doi.org/10. 1016/j.dam.2011.05.013. URL http://www.sciencedirect.com/science/article/pii/S0166218X11001958.

Capitalize "Boolean" in bibliography properly.

# List of Tables

1.1	Corresponding terms used in Boolean function representations	7
1.2	Examples of interval functions	9
2.1	Subvectors of $x$ , $y$ and $c$ in case $o_x < o_y \ldots \ldots \ldots \ldots \ldots$	12

# List of Abbreviations

 $\mathbf{DNF}\,$  disjunctive normal form. ii, 1, 3, 5–8, 20, 21, 26

MSB most significant bit. 4, 12, 15

# Todo list

Make sure citations are typeset properly
¿ Use a different citation style
¿ Change reference names to adhere to reference guidelines at http://en.
wikibooks.org/wiki/LaTeX/Labels_and_Cross-referencing
¿ Remove citation from abstract
Does Umans show this for term-wise minimization as well? Note that Čepek
et al. uses $\Sigma$ with CNF representations. Shouldn't one of the problems
be $\Pi_2$ -hard instead?
Define switch in Definitions
¿ Mention the "Better approximation is hard" result
$\mathcal{E}_{\mathcal{E}}$ Change to ····
Wrap in table environment and add a caption
¿ Relate orthogonality to disjointness of essential sets. Don't forget to deal with DNF/CNF difference
¿ Reword
Is it actually equivalent? Is "equivalent" a correct word, esp. since Cepek's coverability is in CNF (dual)?
Write the proof. May require many definitions
Define $l$ -switch function
Show that complementing bits preserves number of switches
Buď rozvést nebo odstranit
Rozvedeno; stačí takhle?
¿ Typeset "1-1" properly (correct dash etc.)
¿ Prove correctness
$\xi$ Show in detail that vectors created from different 1 bits in $c$ must differ.
pokud chcete mít v citacích jméno, tak použijte odpovídající BiBTeXový
styl (autoři rok)
Does it?
Reword "seem to require"
¿ Move definition to Definitions if the term is used in any chapter except 2interval
$\xi$ Add "Equivalently, a $k$ -interval function is [?]-switch in case"
Note that the proof could be rephrased using orthogonal sets explicitly.
¿ Consider rewording, e.g. "one-to-one correspondence" or "correspondence".
Prove that $f'$ doesn't have more switch vectors
¿ Elaborate
Note that with Kucera on 15 April 2015, we found it necessary for f to also
have the false point $1^{\{n-1\}}0$ for the procedure to work. I believe that
the proof also works in the other case as well
Review
Put the chapter in the context of the preceding chapters
Treat (explicitly) the degenerate cases: $a_1 = 0$ , $b_k = 2^n - 1$ , $j = n$ , $j = n - 1$ .
Go into more detail
Clarify: the interval is prefix or suffix on $n-j-1$ bits, but not in general
on $n$ hits

¿ Leave the chapter out, since the result is not very interesting and the	
proof is quite complicated. Or give just a sketch of the proof	24
¿ Use a better chapter title	24
Finish the chapter	24
Consider rewording	24
Typeset better; esp. don't show the bullet here	24
Really?	25
Insert the number here.	25
Use a better algorithm – one that produces merely $n+l-2$ vectors	25
Finish	25
	26
Really? Probably yes; note that we can translate a k-interval function in a	
	26
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	27