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## Peter Clote • Evangelos Kranakis

# Boolean Functions and Computation Models 

With 19 Figures

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Dedicated to our parents:
Mary Ann and Paul J. Clote Stamatia and Kostantinos Kranakis

## Preface

The foundations of computational complexity theory go back to Alan Turing in the 1930s who was concerned with the existence of automatic procedures deciding the validity of mathematical statements. The first example of such a problem was the undecidability of the Halting Problem which is essentially the question of debugging a computer program: Will a given program eventually halt? Computational complexity today addresses the quantitative aspects of the solutions obtained: Is the problem to be solved tractable? But how does one measure the intractability of computation? Several ideas were proposed: A. Cobham [Cob65] raised the question of what is the right model in order to measure a "computation step", M. Rabin [Rab60] proposed the introduction of axioms that a complexity measure should satisfy, and C. Shannon [Sha49] suggested the boolean circuit that computes a boolean function.

However, an important question remains: What is the nature of computation? In 1957, John von Neumann [vN58] wrote in his notes for the Silliman Lectures concerning the nature of computation and the human brain that
... logics and statistics should be primarily, although not exclusively, viewed as the basic tools of 'information theory'. Also, that body of experience which has grown up around the planning, evaluating, and coding of complicated logical and mathematical automata will be the focus of much of this information theory. The most typical, but not the only, such automata are, of course, the large electronic computing machines.
Let me note, in passing, that it would be very satisfactory if one could talk about a 'theory' of such automata. Regrettably, what at this moment exists - and to what I must appeal - can as yet be described only as an imperfectly articulated and hardly formalized 'body of experience'.

With almost a half century after von Neumann's death, the theory of computation and automata is now a well-developed and sophisticated branch of mathematics and computer science. As he forecasted, the principal tools have proven to come from the fields of mathematical logic, combinatorics, and probability theory.

Using these tools, we have attempted to give a survey of the present state of research in the study of boolean functions, formulas, circuits, and
propositional proof systems. All of these subjects are related to the overriding concern of how computation can be modeled, and what limitations and interrelations there are between different computation models.

This text is structured as follows. We begin with methods for the construction of boolean circuits which compute certain arithmetic and combinatorial functions, and investigate upper and lower bounds for circuit families. The techniques used are from combinatorics, probability and finite group theory. We then survey steps taken in a program initiated by S.A. Cook of investigating non-deterministic polynomial time, from a proof-theoretic viewpoint. Specifically, lower bounds are presented for lengths of proofs for families of propositional tautologies, when proven in certain proof systems. Techniques here involve both logic and finite combinatorics and are related to constant depth boolean circuits and to monotone arithmetic circuits.

## Outline of the book

A more detailed breakdown of the book is as follows. In Chapter 1, circuits are constructed for data processing (string searching, parsing) and arithmetic (multiplication, division, fast Fourier transform). This material is intended to provide the reader with concrete examples, before initiating a more abstract study of circuit depth and size.

Chapter 2 presents a sampling of techniques to prove size lower bounds for certain restricted classes of circuits - constant depth or monotonic. These include Razborov's elegant constructive proof of the Håstad switching lemma, the Haken-Cook monotonic real circuit lower bound for the broken moskito screen problem, Razborov's algebraic approximation method for majority, and Smolensky's subsequent generalization to finite fields.

Chapter 3 studies symmetric boolean functions and related invariance groups. A characterization is given of those symmetric functions computable by constant depth polysize circuits. Invariance groups of boolean functions are characterized by a condition concerning orbit structure, and tight upper bounds are given for almost symmetric functions. Applications are given to anonymous networks such as rings and hypercubes. Most of these results are due to P. Clote and E. Kranakis.

Chapter 4 concerns the empirically observed threshold phenomenon concerning clause density $r=\frac{m}{n}$, where with high probability random formulas in $k$-CNF form having $m$ clauses over $n$ variables are satisfiable (unsatisfiable) if $r$ is less (greater) than a threshold limit. The results of this chapter include a proof of an analytic upper bound, a result due to M. Kirousis, E. Kranakis and D. Krizanc.

Chapter 5 studies propositional proof systems, which have relevance to complexity theory, since $\mathrm{NP}=c o-\mathrm{NP}$ if and only if there exists a polynomially bounded propositional proof system. In obtaining exponential lower bounds for increasingly stronger proof systems, new techniques have been developed,
such as random restriction, algebraic and bottleneck counting methods these techniques may ultimately play a role in separating complexity classes, and in any case are of interest in themselves. The proof systems include resolution, cutting planes, threshold logic, Nullstellensatz system, polynomial calculus, constant depth Frege, Frege, extended Frege, and substitution Frege systems.

In Chapter 6 we define various computation models including uniform circuit families, Turing machines and parallel random access machines, and illustrate some features of parallel computation by giving example programs. We then give characterizations of different parallel and sequential complexity classes in terms of function algebras - i.e., as the smallest class of functions containing certain initial functions and closed under certain operations. In the early 1960's, A. Cobham first defined polynomial time $P$ and argued its robustness on the grounds of his machine independent characterization of $P$ via function algebras.

With the development that certain programming languages now admit polymorphism and higher type functionals, using function algebras, complexity theory can now be lifted in a natural manner to higher types, a development which is the focus of Chapter 7 . In that chapter, a new yet unpublished characterization of type $2 \mathrm{NC}^{1}$ functionals (due to the first author) is given in terms of a natural function algebra and related lambda calculus.

## How to use the book

This text is to be of use to students as well as researchers interested in the emerging field of logical complexity theory (also called implicit complexity theory). The chapters of the book can be read as independent units. However one semester courses can be given as follows:

| Semester Course | Chapters |
| :--- | :--- |
| Boolean Functions \& Complexity | $1,2,3$ |
| Proof Systems \& Satisfiability | 5,4 |
| Machine Models, Function Algebras \& Higher Types | 6,7 |

At the end of every chapter, there are several exercises: some are simple extensions of results in the book while others constitute the core result of a research article. The various levels of difficulty are indicated with an asterisk placed before more difficult problems, and two asterisks for quite challenging and sometimes open research problems. The reader is invited to attempt them all.

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Writing this book would have been impossible without the financial support of various research foundations, and without the exchange of ideas from many colleagues and friends.

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