Algorithms and Data Structures

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9.12.2024



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ISBN: 9789403830537

Printed by Bookmundo

Preface

Efficient algorithms and data structures lie at the heart of computer science, forming the foundation of solving complex problems in programming and beyond. The ability to design, analyze, and implement algorithms is essential for tackling the diverse challenges faced by programmers. This book aims to equip readers with the tools and insights necessary to navigate this fascinating field.

To address the core problem areas in computer science, programmers must learn to create new algorithms by skillfully combining existing ones. Equally important is the ability to analyze these algorithms in terms of runtime efficiency and memory usage. Data structures, which organize information to enable efficient algorithmic operations, are another crucial focus of this book.

A clear distinction will be made between data types—the abstract, specificationoriented view of organizing data—and data structures, which represent the concrete implementations of these data types. Readers will discover that a single data type may have multiple implementations, each with its own trade-offs. By exploring these distinctions, this book will help develop a deep understanding of how to select and design efficient solutions for different scenarios.

To fully benefit from this book, a basic proficiency in programming is recommended. Familiarity with a language like Java will be particularly useful. For readers seeking foundational programming skills, I encourage consulting my previous book on programming, which introduces the essential concepts required for effective coding. Additionally, while some mathematical skills can enhance your understanding, I have made a conscious effort to develop all necessary mathematical concepts as part of this book.

To reinforce learning, the book provides numerous exercises, complete with solutions. These exercises are designed to solidify the theoretical concepts and give hands-on experience with practical implementations.

Whether you are a student, a programmer, or simply curious about algorithms and data structures, this book is structured to guide you through the subject step by step. I hope it serves as a valuable resource in your journey into this essential area of computer science.

Chapter 1

Introduction

Algorithms operate on data structures, and data structures contain algorithms as components. Consequently, algorithms and data structures are inseparably linked. In this book, we aim to classify algorithms and data structures within the context of related concepts such as functions, procedures, abstract data types, data types, algebras, types, classes, and modules.

At the most abstract level, we employ mathematics to formalize the specfications of algorithms and data structures. An algorithm realizes a function, which serves as a specification for that algorithm. Likewise, an algorithm itself is a specification of a procedure, function, or method that must eventually be implemented.

It is important to note that algorithms are typically not presented as computer programs. Instead, they are described on a higher, more human-readable level to facilitate communication. However, a computer program are serve as one way to describe an algorithm. In other words, a computer program is an algorithm, but the description of an algorithm is usually not limited to being a computer program.

In the first chapter, we will focus on the analysis of algorithms, specifically examining their runtime and memory usage.

On the side of data structures, we begin with abstract concepts such as abstract data types and algebras, which define concrete data types. A data structure is an implementation of an algebra or an abstract data type at the algorithmic level. Data structures themselves can then be implemented in programming languages. At the programming level, we encounter key concepts such as data types, classes, and modules.

This structured approach allows us to bridge the gap between high-level abstract concepts and their concrete implementations in programming, providing a comprehensive understanding of algorithms and data structures.