# Data Structures and Algorithms

# 

Annotated Reference with Examples

### Data Structures and Algorithms: Annotated Reference with Examples

#### First Edition

Copyright © Granville Barnett, and Luca Del Tongo 2008.



This book is made exclusively available from DotNetSlackers (http://dotnetslackers.com/) the place for .NET articles, and news from some of the leading minds in the software industry.

# Contents

1	Intr	roduction	1
	1.1	What this book is, and what it isn't	1
	1.2	Assumed knowledge	1
		1.2.1 Big Oh notation	1
		1.2.2 Imperative programming language	3
		1.2.3 Object oriented concepts	4
	1.3	Pseudocode	4
	1.4	Tips for working through the examples	6
	1.5	Book outline	6
	1.6	Testing	7
	1.7	Where can I get the code?	7
	1.8	Final messages	7
Ι	Da	ata Structures	8
2	Linl	ked Lists	9
	2.1	Singly Linked List	9
		2.1.1 Insertion	10
		2.1.2 Searching	10
		2.1.3 Deletion	11
		2.1.4 Traversing the list	12
		2.1.5 Traversing the list in reverse order	13
	2.2	Doubly Linked List	13
		2.2.1 Insertion	15
		2.2.2 Deletion	15
		2.2.3 Reverse Traversal	16
	2.3	Summary	17
3	Bin	ary Search Tree	19
J	3.1	Insertion	20
	$3.1 \\ 3.2$	Searching	$\frac{20}{21}$
	$\frac{3.2}{3.3}$	Deletion	$\frac{21}{22}$
	3.4	Finding the parent of a given node	$\frac{22}{24}$
	$\frac{3.4}{3.5}$	Attaining a reference to a node	$\frac{24}{24}$
	$\frac{3.6}{3.7}$	Finding the smallest and largest values in the binary search tree	25 26
	5.7	Tree Traversals	26 26

	3.8	3.7.3 Inorder	26 29 30 31
4	Hea		32
4	4.1		33
	4.1		აა 37
	4.2 $4.3$		οι 38
	4.3 $4.4$	8	აი 41
	$\frac{4.4}{4.5}$		$\frac{41}{42}$
	1.0	Summary	12
5	Sets		<b>44</b>
	5.1	Unordered	46
		5.1.1 Insertion	46
	5.2	Ordered	47
	5.3	Summary	47
6	Que	les 4	<b>48</b>
•	6.1		<b>4</b> 9
	6.2		- 49
	6.3	v -	$\frac{-9}{49}$
	6.4		53
-	A 3 7 1	The second secon	54
7			56 56
	7.1		
	7.2	8	57
	7.3		58
	$7.4 \\ 7.5$		$\frac{59}{61}$
	7.5	Summary	IJΙ
II	A	gorithms	32
8	Sort	nσ	63
	8.1	8	63
	8.2		63
	8.3		65
	8.4	_*	67
	8.5		68
	8.6		68
	8.7		70
9	Nur	eric ,	72
J	9.1		72
	9.1	· ·	72
	9.2		12 73
	9.3	Computing the maximum value for a number of a specific base	10
	9.4		74
	9.5		74
	9.6	Summary	75

<b>10</b>	Searching	<b>76</b>
	10.1 Sequential Search	76
	10.2 Probability Search	76
	10.3 Summary	77
11	Strings	79
	11.1 Reversing the order of words in a sentence	79
	11.2 Detecting a palindrome	80
	11.3 Counting the number of words in a string	81
	11.4 Determining the number of repeated words within a string	83
	11.5 Determining the first matching character between two strings	84
	11.6 Summary	85
$\mathbf{A}$	Algorithm Walkthrough	86
	A.1 Iterative algorithms	86
	A.2 Recursive Algorithms	88
	A.3 Summary	90
В	Translation Walkthrough	91
	B.1 Summary	92
$\mathbf{C}$	Recursive Vs. Iterative Solutions	93
	C.1 Activation Records	94
	C.2 Some problems are recursive in nature	95
	C.3 Summary	95
D	Testing	97
	D.1 What constitutes a unit test?	97
	D.2 When should I write my tests?	98
	D.3 How seriously should I view my test suite?	99
	D.4 The three A's	99
	D.5 The structuring of tests	99
	D.6 Code Coverage	100
	D.7 Summary	
E	Symbol Definitions	101

## **Preface**

Every book has a story as to how it came about and this one is no different, although we would be lying if we said its development had not been somewhat impromptu. Put simply this book is the result of a series of emails sent back and forth between the two authors during the development of a library for the .NET framework of the same name (with the omission of the subtitle of course!). The conversation started off something like, "Why don't we create a more aesthetically pleasing way to present our pseudocode?" After a few weeks this new presentation style had in fact grown into pseudocode listings with chunks of text describing how the data structure or algorithm in question works and various other things about it. At this point we thought, "What the heck, let's make this thing into a book!" And so, in the summer of 2008 we began work on this book side by side with the actual library implementation.

When we started writing this book the only things that we were sure about with respect to how the book should be structured were:

- always make explanations as simple as possible while maintaining a moderately fine degree of precision to keep the more eager minded reader happy;
   and
- 2. inject diagrams to demystify problems that are even moderatly challenging to visualise (... and so we could remember how our own algorithms worked when looking back at them!); and finally
- 3. present concise and self-explanatory pseudocode listings that can be ported easily to most mainstream imperative programming languages like C++, C#, and Java.

A key factor of this book and its associated implementations is that all algorithms (unless otherwise stated) were designed by us, using the theory of the algorithm in question as a guideline (for which we are eternally grateful to their original creators). Therefore they may sometimes turn out to be worse than the "normal" implementations—and sometimes not. We are two fellows of the opinion that choice is a great thing. Read our book, read several others on the same subject and use what you see fit from each (if anything) when implementing your own version of the algorithms in question.

Through this book we hope that you will see the absolute necessity of understanding which data structure or algorithm to use for a certain scenario. In all projects, especially those that are concerned with performance (here we apply an even greater emphasis on real-time systems) the selection of the wrong data structure or algorithm can be the cause of a great deal of performance pain. Therefore it is absolutely key that you think about the run time complexity and space requirements of your selected approach. In this book we only explain the theoretical implications to consider, but this is for a good reason: compilers are very different in how they work. One C++ compiler may have some amazing optimisation phases specifically targeted at recursion, another may not, for example. Of course this is just an example but you would be surprised by how many subtle differences there are between compilers. These differences which may make a fast algorithm slow, and vice versa. We could also factor in the same concerns about languages that target virtual machines, leaving all the actual various implementation issues to you given that you will know your language's compiler much better than us...well in most cases. This has resulted in a more concise book that focuses on what we think are the key issues.

One final note: never take the words of others as gospel; verify all that can be feasibly verified and make up your own mind.

We hope you enjoy reading this book as much as we have enjoyed writing it.

Granville Barnett Luca Del Tongo

# Acknowledgements

Writing this short book has been a fun and rewarding experience. We would like to thank, in no particular order the following people who have helped us during the writing of this book.

Sonu Kapoor generously hosted our book which when we released the first draft received over thirteen thousand downloads, without his generosity this book would not have been able to reach so many people. Jon Skeet provided us with an alarming number of suggestions throughout for which we are eternally grateful. Jon also edited this book as well.

We would also like to thank those who provided the odd suggestion via email to us. All feedback was listened to and you will no doubt see some content influenced by your suggestions.

A special thank you also goes out to those who helped publicise this book from Microsoft's Channel 9 weekly show (thanks Dan!) to the many bloggers who helped spread the word. You gave us an audience and for that we are extremely grateful.

Thank you to all who contributed in some way to this book. The programming community never ceases to amaze us in how willing its constituents are to give time to projects such as this one. Thank you.

# About the Authors

#### Granville Barnett

Granville is currently a Ph.D candidate at Queensland University of Technology (QUT) working on parallelism at the Microsoft QUT eResearch Centre<sup>1</sup>. He also holds a degree in Computer Science, and is a Microsoft MVP. His main interests are in programming languages and compilers. Granville can be contacted via one of two places: either his personal website (http://gbarnett.org) or his blog (http://msmvps.com/blogs/gbarnett).

#### Luca Del Tongo

Luca is currently studying for his masters degree in Computer Science at Florence. His main interests vary from web development to research fields such as data mining and computer vision. Luca also maintains an Italian blog which can be found at http://blogs.ugidotnet.org/wetblog/.

<sup>1</sup>http://www.mquter.qut.edu.au/

Page intentionally left blank.

# Chapter 1

# Introduction

#### 1.1 What this book is, and what it isn't

This book provides implementations of common and uncommon algorithms in pseudocode which is language independent and provides for easy porting to most imperative programming languages. It is not a definitive book on the theory of data structures and algorithms.

For the most part this book presents implementations devised by the authors themselves based on the concepts by which the respective algorithms are based upon so it is more than possible that our implementations differ from those considered the norm.

You should use this book alongside another on the same subject, but one that contains formal proofs of the algorithms in question. In this book we use the abstract big Oh notation to depict the run time complexity of algorithms so that the book appeals to a larger audience.

#### 1.2 Assumed knowledge

We have written this book with few assumptions of the reader, but some have been necessary in order to keep the book as concise and approachable as possible. We assume that the reader is familiar with the following:

- 1. Big Oh notation
- 2. An imperative programming language
- 3. Object oriented concepts

#### 1.2.1 Big Oh notation

For run time complexity analysis we use big Oh notation extensively so it is vital that you are familiar with the general concepts to determine which is the best algorithm for you in certain scenarios. We have chosen to use big Oh notation for a few reasons, the most important of which is that it provides an abstract measurement by which we can judge the performance of algorithms without using mathematical proofs.

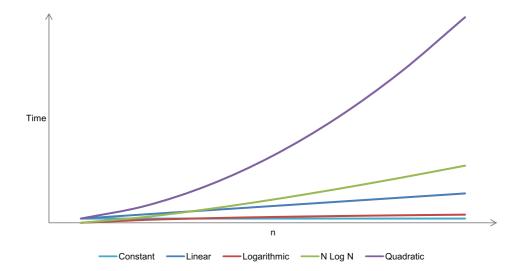


Figure 1.1: Algorithmic run time expansion

Figure 1.1 shows some of the run times to demonstrate how important it is to choose an efficient algorithm. For the sanity of our graph we have omitted cubic  $O(n^3)$ , and exponential  $O(2^n)$  run times. Cubic and exponential algorithms should only ever be used for very small problems (if ever!); avoid them if feasibly possible.

The following list explains some of the most common big Oh notations:

- O(1) constant: the operation doesn't depend on the size of its input, e.g. adding a node to the tail of a linked list where we always maintain a pointer to the tail node.
- O(n) linear: the run time complexity is proportionate to the size of n.
- $O(\log n)$  logarithmic: normally associated with algorithms that break the problem into smaller chunks per each invocation, e.g. searching a binary search tree.
- $O(n \ log \ n)$  just  $n \ log \ n$ : usually associated with an algorithm that breaks the problem into smaller chunks per each invocation, and then takes the results of these smaller chunks and stitches them back together, e.g. quick sort.
  - $O(n^2)$  quadratic: e.g. bubble sort.
  - $O(n^3)$  cubic: very rare.
  - $O(2^n)$  exponential: incredibly rare.

If you encounter either of the latter two items (cubic and exponential) this is really a signal for you to review the design of your algorithm. While prototyping algorithm designs you may just have the intention of solving the problem irrespective of how fast it works. We would strongly advise that you always review your algorithm design and optimise where possible—particularly loops

and recursive calls—so that you can get the most efficient run times for your algorithms.

The biggest asset that big Oh notation gives us is that it allows us to essentially discard things like hardware. If you have two sorting algorithms, one with a quadratic run time, and the other with a logarithmic run time then the logarithmic algorithm will always be faster than the quadratic one when the data set becomes suitably large. This applies even if the former is ran on a machine that is far faster than the latter. Why? Because big Oh notation isolates a key factor in algorithm analysis: growth. An algorithm with a quadratic run time grows faster than one with a logarithmic run time. It is generally said at some point as  $n \to \infty$  the logarithmic algorithm will become faster than the quadratic algorithm.

Big Oh notation also acts as a communication tool. Picture the scene: you are having a meeting with some fellow developers within your product group. You are discussing prototype algorithms for node discovery in massive networks. Several minutes elapse after you and two others have discussed your respective algorithms and how they work. Does this give you a good idea of how fast each respective algorithm is? No. The result of such a discussion will tell you more about the high level algorithm design rather than its efficiency. Replay the scene back in your head, but this time as well as talking about algorithm design each respective developer states the asymptotic run time of their algorithm. Using the latter approach you not only get a good general idea about the algorithm design, but also key efficiency data which allows you to make better choices when it comes to selecting an algorithm fit for purpose.

Some readers may actually work in a product group where they are given budgets per feature. Each feature holds with it a budget that represents its uppermost time bound. If you save some time in one feature it doesn't necessarily give you a buffer for the remaining features. Imagine you are working on an application, and you are in the team that is developing the routines that will essentially spin up everything that is required when the application is started. Everything is great until your boss comes in and tells you that the start up time should not exceed n ms. The efficiency of every algorithm that is invoked during start up in this example is absolutely key to a successful product. Even if you don't have these budgets you should still strive for optimal solutions.

Taking a quantitative approach for many software development properties will make you a far superior programmer - measuring one's work is critical to success.

#### 1.2.2 Imperative programming language

All examples are given in a pseudo-imperative coding format and so the reader must know the basics of some imperative mainstream programming language to port the examples effectively, we have written this book with the following target languages in mind:

- 1. C++
- 2. C#
- 3. Java

The reason that we are explicit in this requirement is simple—all our implementations are based on an imperative thinking style. If you are a functional programmer you will need to apply various aspects from the functional paradigm to produce efficient solutions with respect to your functional language whether it be Haskell, F#, OCaml, etc.

Two of the languages that we have listed (C# and Java) target virtual machines which provide various things like security sand boxing, and memory management via garbage collection algorithms. It is trivial to port our implementations to these languages. When porting to C++ you must remember to use pointers for certain things. For example, when we describe a linked list node as having a reference to the next node, this description is in the context of a managed environment. In C++ you should interpret the reference as a pointer to the next node and so on. For programmers who have a fair amount of experience with their respective language these subtleties will present no issue, which is why we really do emphasise that the reader must be comfortable with at least one imperative language in order to successfully port the pseudo-implementations in this book.

It is essential that the user is familiar with primitive imperative language constructs before reading this book otherwise you will just get lost. Some algorithms presented in this book can be confusing to follow even for experienced programmers!

#### 1.2.3 Object oriented concepts

For the most part this book does not use features that are specific to any one language. In particular, we never provide data structures or algorithms that work on generic types—this is in order to make the samples as easy to follow as possible. However, to appreciate the designs of our data structures you will need to be familiar with the following object oriented (OO) concepts:

- 1. Inheritance
- 2. Encapsulation
- 3. Polymorphism

This is especially important if you are planning on looking at the C# target that we have implemented (more on that in  $\S1.7$ ) which makes extensive use of the OO concepts listed above. As a final note it is also desirable that the reader is familiar with interfaces as the C# target uses interfaces throughout the sorting algorithms.

#### 1.3 Pseudocode

Throughout this book we use pseudocode to describe our solutions. For the most part interpreting the pseudocode is trivial as it looks very much like a more abstract C++, or C#, but there are a few things to point out:

- 1. Pre-conditions should always be enforced
- 2. Post-conditions represent the result of applying algorithm a to data structure d

- 3. The type of parameters is inferred
- 4. All primitive language constructs are explicitly begun and ended

If an algorithm has a return type it will often be presented in the postcondition, but where the return type is sufficiently obvious it may be omitted for the sake of brevity.

Most algorithms in this book require parameters, and because we assign no explicit type to those parameters the type is inferred from the contexts in which it is used, and the operations performed upon it. Additionally, the name of the parameter usually acts as the biggest clue to its type. For instance n is a pseudo-name for a number and so you can assume unless otherwise stated that n translates to an integer that has the same number of bits as a WORD on a 32 bit machine, similarly l is a pseudo-name for a list where a list is a resizeable array (e.g. a vector).

The last major point of reference is that we always explicitly end a language construct. For instance if we wish to close the scope of a **for** loop we will explicitly state **end for** rather than leaving the interpretation of when scopes are closed to the reader. While implicit scope closure works well in simple code, in complex cases it can lead to ambiguity.

The pseudocode style that we use within this book is rather straightforward. All algorithms start with a simple algorithm signature, e.g.

```
1) algorithm Algorithm
Name (arg1, arg2, ..., argN) 2) ... n) end Algorithm
Name
```

Immediately after the algorithm signature we list any  ${\bf Pre}$  or  ${\bf Post}$  conditions.

```
    algorithm AlgorithmName(n)
    Pre: n is the value to compute the factorial of
    n ≥ 0
    Post: the factorial of n has been computed
    // ...
    end AlgorithmName
```

The example above describes an algorithm by the name of AlgorithmName, which takes a single numeric parameter n. The pre and post conditions follow the algorithm signature; you should always enforce the pre-conditions of an algorithm when porting them to your language of choice.

Normally what is listed as a pre-conidition is critical to the algorithms operation. This may cover things like the actual parameter not being null, or that the collection passed in must contain at least n items. The post-condition mainly describes the effect of the algorithms operation. An example of a post-condition might be "The list has been sorted in ascending order"

Because everything we describe is language independent you will need to make your own mind up on how to best handle pre-conditions. For example, in the C# target we have implemented, we consider non-conformance to pre-conditions to be exceptional cases. We provide a message in the exception to tell the caller why the algorithm has failed to execute normally.

#### 1.4 Tips for working through the examples

As with most books you get out what you put in and so we recommend that in order to get the most out of this book you work through each algorithm with a pen and paper to track things like variable names, recursive calls etc.

The best way to work through algorithms is to set up a table, and in that table give each variable its own column and continuously update these columns. This will help you keep track of and visualise the mutations that are occurring throughout the algorithm. Often while working through algorithms in such a way you can intuitively map relationships between data structures rather than trying to work out a few values on paper and the rest in your head. We suggest you put everything on paper irrespective of how trivial some variables and calculations may be so that you always have a point of reference.

When dealing with recursive algorithm traces we recommend you do the same as the above, but also have a table that records function calls and who they return to. This approach is a far cleaner way than drawing out an elaborate map of function calls with arrows to one another, which gets large quickly and simply makes things more complex to follow. Track everything in a simple and systematic way to make your time studying the implementations far easier.

#### 1.5 Book outline

We have split this book into two parts:

- Part 1: Provides discussion and pseudo-implementations of common and uncommon data structures; and
- Part 2: Provides algorithms of varying purposes from sorting to string operations.

The reader doesn't have to read the book sequentially from beginning to end: chapters can be read independently from one another. We suggest that in part 1 you read each chapter in its entirety, but in part 2 you can get away with just reading the section of a chapter that describes the algorithm you are interested in.

Each of the chapters on data structures present initially the algorithms concerned with:

- 1. Insertion
- 2. Deletion
- 3. Searching

The previous list represents what we believe in the vast majority of cases to be the most important for each respective data structure.

For all readers we recommend that before looking at any algorithm you quickly look at Appendix E which contains a table listing the various symbols used within our algorithms and their meaning. One keyword that we would like to point out here is **yield**. You can think of **yield** in the same light as **return**. The **return** keyword causes the method to exit and returns control to the caller, whereas **yield** returns each value to the caller. With **yield** control only returns to the caller when all values to return to the caller have been exhausted.

#### 1.6 Testing

All the data structures and algorithms have been tested using a minimised test driven development style on paper to flesh out the pseudocode algorithm. We then transcribe these tests into unit tests satisfying them one by one. When all the test cases have been progressively satisfied we consider that algorithm suitably tested.

For the most part algorithms have fairly obvious cases which need to be satisfied. Some however have many areas which can prove to be more complex to satisfy. With such algorithms we will point out the test cases which are tricky and the corresponding portions of pseudocode within the algorithm that satisfy that respective case.

As you become more familiar with the actual problem you will be able to intuitively identify areas which may cause problems for your algorithms implementation. This in some cases will yield an overwhelming list of concerns which will hinder your ability to design an algorithm greatly. When you are bombarded with such a vast amount of concerns look at the overall problem again and sub-divide the problem into smaller problems. Solving the smaller problems and then composing them is a far easier task than clouding your mind with too many little details.

The only type of testing that we use in the implementation of all that is provided in this book are unit tests. Because unit tests contribute such a core piece of creating somewhat more stable software we invite the reader to view Appendix D which describes testing in more depth.

#### 1.7 Where can I get the code?

This book doesn't provide any code specifically aligned with it, however we do actively maintain an open source project<sup>1</sup> that houses a C# implementation of all the pseudocode listed. The project is named *Data Structures and Algorithms* (DSA) and can be found at http://codeplex.com/dsa.

#### 1.8 Final messages

We have just a few final messages to the reader that we hope you digest before you embark on reading this book:

- 1. Understand how the algorithm works first in an abstract sense; and
- 2. Always work through the algorithms on paper to understand how they achieve their outcome

If you always follow these key points, you will get the most out of this book.

 $<sup>^1</sup>$ All readers are encouraged to provide suggestions, feature requests, and bugs so we can further improve our implementations.

# Part I Data Structures