

PETER J. BENTLEY

---

# DIGITI IZED

the science of  
computers and  
how it shapes  
our world



---

DIGITIZED

---

*This page intentionally left blank*

---

# **DIGITIZED**

The science of computers and  
how it shapes our world

Peter J. Bentley

**OXFORD**  
UNIVERSITY PRESS

---

# OXFORD

UNIVERSITY PRESS

Great Clarendon Street, Oxford OX2 6DP

Oxford University Press is a department of the University of Oxford.  
It furthers the University's objective of excellence in research, scholarship,  
and education by publishing worldwide in

Oxford New York

Auckland Cape Town Dar es Salaam Hong Kong Karachi

Kuala Lumpur Madrid Melbourne Mexico City Nairobi

New Delhi Shanghai Taipei Toronto

With offices in

Argentina Austria Brazil Chile Czech Republic France Greece

Guatemala Hungary Italy Japan Poland Portugal Singapore

South Korea Switzerland Thailand Turkey Ukraine Vietnam

Oxford is a registered trade mark of Oxford University Press  
in the UK and in certain other countries

Published in the United States  
by Oxford University Press Inc., New York

© Peter J. Bentley 2012

The moral rights of the author have been asserted  
Database right Oxford University Press (maker)

First Edition 2012

All rights reserved. No part of this publication may be reproduced,  
stored in a retrieval system, or transmitted, in any form or by any means,  
without the prior permission in writing of Oxford University Press,  
or as expressly permitted by law, or under terms agreed with the appropriate  
reprographics rights organization. Enquiries concerning reproduction  
outside the scope of the above should be sent to the Rights Department,  
Oxford University Press, at the address above

You must not circulate this book in any other binding or cover  
and you must impose the same condition on any acquirer

British Library Cataloguing in Publication Data  
Data available

Library of Congress Cataloguing in Publication Data  
Data available

Typeset by SPI Publisher Services, Pondicherry, India  
Printed in Great Britain  
on acid-free paper by  
Clay's Ltd, St Ives plc

ISBN 978-0-19-969379-5

10 9 8 7 6 5 4 3 2 1

---

# CONTENTS

<i>Acknowledgements</i>	xi
<i>List of Illustrations</i>	xiii
<b>000</b> Introduction	1
Computers uncovered	4
The science of computers	8
<b>001</b> Can You Compute?	13
Understanding the impossible	16
Turing's unstopable machines	21
Turing's legacy	25
Complexity is simple	29
Does $P = NP$ ?	34
Oracles and other complexities	38
Theoretical futures	41
<b>010</b> Disposable Computing	43
Thinking logically	45
Building brains	49
Anatomy of a digital brain	54
The end of the beginning	58
The Law of Moore	62

	The future is many	67
	Beyond von Neumann	71
<b>011</b>	Your Life in Binary Digits	74
	Learning to program computers	80
	Climbing higher	85
	Bases for data	91
	Software crisis	95
	Virtual futures	102
<b>100</b>	Monkeys with World-Spanning Voices	104
	Diverse connections	108
	Inter-networking	112
	Addressing for success	119
	Spinning webs over networks	123
	Weaving tangled webs	129
	Webs of deceit	134
	Digital lives	137
<b>101</b>	My Computer Made Me Cry	140
	The birth of friendly computing	145
	Seeing with new eyes	149
	Photos and chicken wire	153
	Waking dreams	156
	It's not what you do but the way that you do it	162
	My pet computer	168
	Human–computer integration	170
<b>110</b>	Building Bionic Brains	173
	Teaching computers how to play	175
	The birth of intelligence	179

---

## CONTENTS

The seasons of AI	182
Intelligence from feet to head	190
Adaptation by natural selection	195
Learning to learn, predicting the predictors	201
Complex futures	205
<b>111 A Computer Changed My Life</b>	209
Computer creativity	210
Computational biology	218
Computer medicine	225
Computer detectives	233
<i>Endnotes</i>	241
<i>Bibliographic Notes</i>	263
<i>Index</i>	285



---

*This page intentionally left blank*

---

In 2010 the Department of Computer Science, University  
College London, celebrated its 30th anniversary. May it  
celebrate many more!

---

*This page intentionally left blank*

---

## ACKNOWLEDGEMENTS

Thanks to all the computer scientists around the world who agreed to be interviewed for this book, and who provided their valuable comments on the content. They are: Amiran Ambroladze, Nadia Berthouze, Sue Black, Ann Blandford, Rod Brooks, Nicolas Courtois, Jon Crowcroft, Bruce Damer, Anthony Finkelstein, Peter Kirstein, Mark Handley, Mark Harman, Mark Herbster, Robin Hirsch, Paulien Hogeweg, John Holland, Owen Holland, Daniel Hulme, Phil Husband, David Jones, Jason Kingdon, Bill Langdon, William Latham, Jon McCormack, Marvin Minsky, Gordana Novakovic, David Patterson, Angela Sasse, John Shawe-Taylor, Mel Slater, Ian Sommerville, Philip Treleaven, Andy Tyrrell.

Many thanks to all those who responded to my question ‘What is Computer Science?’ They are: Alfred Inselberg, Amin Gheibi, Angela Sasse, Ann Blandford, Anthony Finkelstein, Barry Fagin, Bernard Moret, Bruce Damer, Chantal Enguehard, Chris Clack, Chris Porter, Christian Drescher, Damon Wischik, Danny Alexander, Dave Twisleton, David Clark, Derek Hill, Douglas Bridges, Eduard Hovy, Gabriel Brostow, Ged Ridgway, Joel Jordan, Karl Leung, Katharina Morik, Katrina Falkner, Marina Gavrilova, Mark Harman, Martin Amos, Martin Sewell, Mateusz Dykiert, Max Christian, Michael Firman, Mieczyslaw

Klopotek, Mustafa Bozkurt, Nicolas Courtois, Norm Matloff, Pere Villez, Peter Lewis, Rob Pefferly, Robert van de Geijn, Sam Gan, Selim Aki, Sitharama Iyengar, Spyridon Revithis, Stefano Levialdi, Susan Stepney, Tim Weyrich, Vagan Terziyan, William Buckley.

Thanks also to my band of proof-readers, distracters, and loved ones (you know which you are): Soo Ling Lim, John Bentley, Sue Black, Arturo Araujo.

This book would not have been possible without the support of the Department of Computer Science, University College London. Many UCL researchers (already listed above) were generous enough to provide their words in this book, and check the accuracy of the content.

(As usual), I would like to thank the cruel and indifferent, yet astonishingly creative processes of natural evolution for providing the inspiration for my work. Long may it continue to do so.

Finally I'd like to thank my mother who passed away suddenly in 2009. She helped nurture my love of books and writing throughout my childhood, and she was perhaps the biggest fan of my own books. She was also my friend. We miss you, Mum.

---

## LIST OF ILLUSTRATIONS

1. Alan Turing (far left, on the steps of the bus) with members of the Walton Athletic Club, 1946.  
By kind permission of the Provost and Fellows, King's College, Cambridge 27
2. Shannon's Boolean logic AND and OR switches. Adapted from 'A symbolic analysis of relay and switching circuits', by C. E. Shannon, Thesis (M.S.), Massachusetts Institute of Technology, Department of Electrical Engineering, 1940 47
3. The Electronic Numerical Integrator and Computer (ENIAC).  
Left to right: PFC Homer Spence; Chief Engineer Presper Eckert; Consulting Engineer Dr John Mauchly; Betty Jean Jennings; BRL-Upenn Liaison Officer Captain Herman Goldstine; Ruth Licterman, 1946.  
© Bettmann/Corbis 53
4. John von Neumann and the first computer at the Institute for Advanced Study (IAS), 1951.  
Photo by Alan Richards, from The Shelby White and Leon Levy Archives Center, Institute for Advanced Study, Princeton, NJ, USA 59

5. Sir Maurice Wilkes in front of the oldest working electronic computer (originally built for the Atomic Energy Research Establishment in Harwell in 1951) at the National Museum of Computing, Bletchley Park, 2009.  
© John Robertson/Alamy 90
6. Peter Kirstein in front of racks of modern computer servers in the machine room of Computer Science, UCL, 2011.  
© Peter J. Bentley 119
7. Claude Shannon and 'Theseus' the Maze-Solving Mouse, moved magnetically by his maze-solving machine, 1952.  
© Time & Life Pictures/Getty Images 176

---

000

---

# Introduction

They obey our instructions with unlimited patience. They store the world's knowledge and make it accessible in a split second. They are the backbone of modern society. Yet they are largely ignored.

Computers. They comprise our crowning achievements to date, the pinnacle of all tools. Computer processors and software represent the most complex designs humans have ever created. The science of computers has enabled one of the most extraordinary transformations of our societies in human history.

You switch on your computer and launch the Internet browser. A one-word search for 'pizza' finds a list of pizza restaurants in your area. One click with the mouse and you are typing in your address to see if this restaurant delivers. They do! And they also allow you to order online. You choose the type of pizza you feel like, adding your favourite toppings. The restaurant even allows you to pay online, so you type in your credit card number, your address, and the time you'd like the delivery. You choose 'as soon as possible' and click 'pay'.

Just thirty-five minutes later there is a knock on your door. The pizza is here, smelling delicious. You tip the delivery guy and take the pizza to your table to eat.



Ordering pizza is nothing unusual for many of us around the world. Although it may seem surprising, this increasingly common scenario with cheap prices, fast delivery, and access to such variety of food for millions of customers is only possible because of computers. In the situation above you might have spotted just one computer. If we take a look behind the scenes, the number of computers involved in bringing your pizza is astonishing.

When you switched on your computer, you actually powered up many computers that all work together to make the display, mouse, keyboard, broadband, and main computer operate. Your computer linked itself to the Internet—which is a worldwide network of computers—with the help of computers of the phone company and Internet service provider. When you searched for ‘pizza’ the request was routed between several computers before reaching the search engine computers. These special machines keep an up-to-date index of the Internet and search this summary to provide near-instant results for you—a list of links to pizza restaurants. When you clicked on a link, your computer was directed (through another chain of computers) to the restaurant computers, which provided details of their products back to your own computer. The pizza toppings you selected on your computer were sent to their computer so it could calculate the price. When you clicked ‘pay’, your computer talked via a secure encrypted link to another computer, which talked using more secure links to the bank and transferred the payment from your account into the account of the restaurant.

With the payment completed, the main computer of the restaurant chain then sent your order to the computer of your local restaurant. The kitchen received the order just thirty seconds after you paid online and they began making your pizza. It’s a good restaurant so they made

it from scratch using ingredients such as cornmeal, wheatflour, tomato sauce, mozzarella cheese, pepperoni, olive oil.

But there is a contradiction—the restaurant has very cheap prices and yet it uses good quality ingredients. It can only have this fine selection of Italian ingredients because of highly accurate stock-keeping which minimizes waste, and high-volume ordering which reduces the price. To achieve this, the restaurant's computer keeps track of the sales and stock levels each day (combined with data gathered over the last two years), automatically preparing a proposed order for the manager to approve or amend.<sup>1</sup> The approved order is then sent to the main computer of the restaurant chain, which in turn places the combined orders from all its restaurants to the various food suppliers. The orders cause a ripple of computers to talk to each other in distribution companies, food-processing factories, shipping companies, and food production companies, all over the world.<sup>2</sup> The mozzarella may have come from Italy, your pepperoni from Ireland, your cornmeal from USA. Every company relies on its computers to maintain and enable their accounts, salaries, schedules, stock, communications, and many use computer-controlled machines in their factories.

Just ten minutes after you clicked 'pay' on your computer, your pizza had been made using those fresh ingredients. The chef then placed it on a computer-controlled conveyer oven designed to be energy efficient and fast. It rolled in raw and less than ten minutes later it rolled out perfectly cooked. The delivery man then packed the pizza in a box (which had been manufactured by a computer-controlled cardboard-cutting machine a few days earlier). He collected several deliveries together into a bag designed to keep the food hot, and went to his vehicle.

In your case, since the restaurant services a large area, the delivery man used a car. Like most modern cars, his was packed full of computers to make the engine run efficiently, provide traction control, anti-lock braking, climate control, and even make his radio work. The radio signal he listened to had originated in a studio a split second earlier, and yet another chain of computer-controlled communication had brought the radio signal to his car. He was new to the job so he used a GPS gadget to find his way—a computer which listened to signals beamed from orbiting satellites produced by their computers (and calibrated by yet more computers).

Unknown to you, he still managed to become lost. Thirty minutes after you clicked 'pay' he was using his mobile phone to call the restaurant to check your address. The device used its tiny internal computers to send a special wireless signal, which was received by several computers in nearby cellular receivers. They negotiated with each other and his phone, calculating the best way to route his signal to the restaurant, and dynamically changing the route based on signal strength and capacity of each receiver. His conversation was successful thanks to this constantly changing network of computers, and he realized he'd typed in your address incorrectly.

Five minutes later he arrived at your home. He took out your pizza from his bag and knocked on your door.

## Computers uncovered

Look at any common activity in the modern world and you'll find more computers lurking behind the scenes than you ever imagined. Our computers are hidden to such an extent that most of us are completely oblivious to their existence. If they could feel emotions,<sup>a</sup>

they'd be feeling quite unappreciated right now. Computers are camouflaged but we don't need to wear Safari clothes and use binoculars to find them—we can just look a little more deeply at any common activity. Switch on a light and your room is brightened because computers in the power station enable the right flow of electricity at the right times. Call a friend on your phone and you initiate an extraordinary network of computers talking to each other so that your voice can reach the ear of your pal. Watch television and you're seeing images decoded in real-time by a computer, which were transmitted using computers and recorded digitally with computers. Computers are our invisible helpers, discreetly enabling almost every aspect of our lives.

I can't help being astonished at the impact of computer science on people. Just a few short years ago it was only computer scientists like myself who spoke the obscure language of emails, Web pages, directories, and operating systems. Today I can sit on a train and hear people, from toddlers to Grandmothers, using these words—and using them correctly. Gossip and fashion magazines now feature articles about computers, and the same magazines can be read online or on tablet computers. The technology that was once confined to our computing labs has spread across the world like wildfire. Imagine if a similar revolution had happened in biology. We'd all be using complicated words like plasma membranes, ribosomes, and cytoskeletons.

Twenty years ago I remember seeing prototype videophones and 3D television in the depths of computer labs—technologies that are now becoming mainstream consumer products. I remember the first optical character recognition (OCR) programs, which struggled to read anything correctly. Now fifteen (and rising) per cent of all books ever written have been digitized using OCR technology, allowing us to

perform instant searches for occurrences of phrases or words through their 500 billion words.<sup>3</sup>

I recall the beginnings of the World Wide Web very clearly.<sup>b</sup> When I saw my first Web page, I couldn't see the point of it. Why would anyone want to wait ten minutes for some text and an image? Twenty years later and my television can browse the Internet and play movies provided online by television companies. My phone can browse the Internet and show me a satellite picture of my exact location anywhere on Earth. I can buy almost any product online from almost any country in the world and have it delivered direct to my home. In the next twenty years it is hard to predict what we will be able to achieve. I suspect the technology will be cheaper, faster, and more impressive than anything we might imagine today.

Whatever you do, no matter which job or recreational pursuit, you will be using a computer of some kind, whether you are aware of it or not. They are so useful, and so cheap to make, that we use them for every conceivable activity. Industries centred on computers are predicted to be the fastest growing of all for the foreseeable future, with only medical services matching this growth.<sup>c,4</sup> The industries that are growing the most did not even exist a few decades ago: information technology consulting, Internet hosting and publishing, cable and satellite programming, computer systems design, software publishing. It's no co-incidence that many of the world's richest people are in the computer business.<sup>5</sup> Who would have guessed that computers could outsell oil, steel, food, or fashion? Whatever your ambitions, you need to understand computers (or at least how to use them effectively) in order to succeed in the modern world.

Today to say that you are working with computers is meaningless. We all do. The question is what do you use the computer for? Are you

an artist or musician? A writer or blogger? Are you a financial trader or salesperson? A product designer or engineer? A surgeon or nurse? A supermarket assistant or fast food cook? A college or school student? Computers are such a fundamental part of our lives that it's hard to understate the importance of computer literacy. Your whole working life (or your children's lives) is likely to involve using these electronic machines.

In this book I'll reveal the secrets of computer science that are not taught in schools or colleges, but which enable our computer-filled world to function. We will go on a journey through the hidden labs of computer scientists. I'll introduce you to many of the researchers (and one or two self-made millionaires) who have developed and are still developing the technological miracles that surround us. With their help we will see how computers are used in myriad different applications.

I'll show you that computers are fundamentally very simple to understand, and how you can use that knowledge to excel in your work and play. Together we will explore how this young discipline grew from its theoretical conception by pioneers such as Alan Turing, through its growth spurts in the Internet, its difficult adolescent stage where the promises of artificial intelligence were never achieved, and the dot-com bubble which grew until it burst, to its current stage as a (semi)mature field, now capable of remarkable achievements. We will see the successes and failures of computer science through the years with the help of leading researchers and pioneers, and discover what innovations may change our world in the next twenty years.

I am an enthusiastic guide, for I am a computer scientist myself. You can't grow up building robots and programming computers without having a fascination for the subject. They may be our silent slaves,

performing every instruction blindly, but I believe that computers have much to teach us about our world and ourselves.

## The science of computers

The pizza story may have helped you to spot computers living in the wild. Yet the physical devices and the software that they run are just the tip of the iceberg. There is so much more to computers than a bunch of silicon chips and programs. There has to be—for otherwise computers could never have become so widespread.

Computer science is the music of mathematics and engineering. Just as it is impossible to understand the diversity and complexity of music from a few instruments or popular songs, it is not possible to learn about computers from a few specific examples of computers or software packages. Music has a rich history and tradition, controversy and emotion. It is filled with ideas and theories, methods and instruments, virtuoso performers. Computer science is the same. Its history may be much shorter, but there is plenty of it. Computer science has its traditions, its controversies, and emotions. At its core are theories and ideas, which are built into methods and performed using computing instruments. There are virtuosos in computer science, although they may never wear tuxedos or perform in front of audiences, and they rarely receive rapturous applause from the general public, despite transforming the lives of millions. More likely they are ordinary-looking people who work in jeans and drink too many soft drinks or too much coffee.

Ask members of the public what they think about computer science, and you hear some interesting replies. Here are a few I've heard when I asked this question:

Computer science has to do with hardware and software.

Computer science is messing about with computers.

Computer science is mainly programming, engineering, and maths.

Computer science is as wide as the food industry.

These answers are not wrong, and perhaps you agree with them. But I hope that by the time you reach the end of this book your answer might be a little different.

Computer science is the mysterious field from which all computer technology originates. Its practitioners often work in university laboratories or technology companies. But some may be found in unlikely places such as cancer research laboratories, banks, computer games companies, art studios, car manufacturers, or publishers. If you are a computer scientist you could be working on almost anything, anywhere—it's one of the joys of working in the field.

The discipline of computer science is so new and diverse that some prefer to call it a branch of engineering or mathematics. Perhaps surprisingly for a professional discipline, computer science has something of an identity problem. Biologists have a pretty clear idea of what their area includes and what it does not. Physicists are even more precise. But ask some leading computer scientists for their personal definition of computer science and the result is a little different. Their diverse answers provide a fascinating snapshot of the mixture of research and development that takes place in this field. To show you what I mean, I sent out the question, 'What is your personal definition of computer science?' to mailing lists, social networking sites, and chat groups used by computer scientists. (If you want to talk to computer scientists, it's best to use the computer.) Here are just a few of the responses I received, kindly sent to me from computer scientists all



- [download Turning 15 on the Road to Freedom: My Story of the Selma Voting Rights March](#)
- [\*\*download online Faith Bass Darling's Last Garage Sale: A Novel for free\*\*](#)
- [read online The Malayan Campaign 1948-60 \(Men-at-Arms, Volume 132\)](#)
- [read online The Half Has Never Been Told: Slavery and the Making of American Capitalism](#)
- [download online Our First Revolution: The Remarkable British Upheaval That Inspired America's Founding Fathers](#)
- [\*\*download Red Cavalry and Other Stories \(Penguin Classics\)\*\*](#)
  
- <http://nautickim.es/books/Turning-15-on-the-Road-to-Freedom--My-Story-of-the-Selma-Voting-Rights-March.pdf>
- <http://yachtwebsitedemo.com/books/Blowback--Scot-Harvath--Book-4-.pdf>
- <http://omarnajmi.com/library/On-Being-Human--Why-Mind-Matters.pdf>
- <http://aircon.servicessingaporecompany.com/?lib/The-Half-Has-Never-Been-Told--Slavery-and-the-Making-of-American-Capitalism.pdf>
- <http://nautickim.es/books/Shadow-Mountain--A-Memoir-of-Wolves--a-Woman--and-the-Wild.pdf>
- <http://crackingscience.org/?library/Red-Cavalry-and-Other-Stories--Penguin-Classics-.pdf>