

INFORMATIONAL DISPERSAL AND PARALLEL PROCESSING



### **Cambridge International Series on Parallel Computation**

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# INFORMATION DISPERSAL AND PARALLEL COMPUTATION

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To the memory of Christine Lyuu



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### **Preface**

It has long been recognized that computer design utilizing more than one processor is one promising approach — some say the only approach — toward more powerful computing machines. Once one adopts this view, several issues immediately emerge: how to connect processors and memories, how do processors communicate efficiently, how to tolerate faults, how to exploit the redundancy inherent in multiprocessors to perform on-line maintenance and repair, and so forth.

This book confronts the above-mentioned issues with two keys insights. There exist error-correcting codes that generate redundancy which is efficient in terms of the number of bits. Such redundancy is used to correct errors and erasures caused by component failures and resource limitations (such as limited buffer size). This insight comes from Michael Rabin. The next insight, due to Leslie Valiant, demonstrates the criticality of randomization in achieving communication efficiency.

We intend to make this book an up-to-date account of the information dispersal approach as it is applied to parallel computation. We also discuss related work in the general area of parallel communication and computation and provide an extensive bibliography in the hope that either might be helpful for researchers and students who want to explore any particular topic. Although materials in this book extend across several disciplines (algebra, coding theory, number theory, arithmetics, algorithms, graph theory, combinatorics, and probability), it is, the author believes, a self-contained book; adequate introduction is given and every proof is complete.

### Technical Summary

Efficient schemes are presented for the following problems: fast parallel communication, low congestion, fault tolerance, simulation of ideal parallel computation models, synchronization in asynchronous networks with low sensitivity to variations in component speed, and on-line maintenance. All of the schemes either employ, or have inspirations from, Rabin's information dispersal idea. We also describe efficient information dispersal algorithms (IDAs) and their application to the enforcement of



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regions of fault containment.

Let N denote the size of the hypercube network. We present a randomized communication scheme, FSRA ("Fault-Tolerant Subcube Routing Algorithm"), that routes in  $2 \log N + 1$  time using only constant size buffers and with probability of success  $1 - N^{-\Theta(\log N)}$ . FSRA furthermore tolerates O(N) random link failures with high probability. Similar results are also proved for the de Bruijn network. A general framework for fault-tolerant routing is described for the large class of node-symmetric networks (such as the hypercube).

FSRA is employed to simulate, without using hashing, a class of CRCW PRAM ("Concurrent-Read Concurrent-Write Parallel Random Access Machine") programs with a slowdown of  $O(\log N)$  with almost certainty if combining is used. Fault-tolerant simulation schemes for general CRCW programs are also presented.

A simple acknowledgment synchronizer can make the routing schemes in this book run on asynchronous networks without loss of efficiency. We further show that speed of any component — be it a processor or a link — has only linear impact on the run-time of FSRA; that is, the extra delay in its run-time is only proportional to the drift in the component's delay and is independent of the size of the network.

On-line maintainability makes the machine more available to the user. We show that, under FSRA, a constant fraction of the links can be disabled with essentially no impact on the routing performance. This result immediately suggests several efficient maintenance and repair procedures.

Based on the above results, a fault-tolerant parallel computing system, called HPC ("hypercube parallel computer"), is sketched at the end of this book.



# Acknowledgments

The study of information dispersal and its various applications was initiated by my thesis advisor at Harvard University, Prof. Michael Rabin, under whose supervision and encouragement I completed my thesis An Information Dispersal Approach to Issues in Parallel Processing and several other papers [233, 234, 235, 236, 237]. The architecture of that thesis is largely preserved in this book. His ability to approach seemingly difficult problems with clear but at first not so obvious insights compels me to strive for simplicity and precision. He also raised the sensitivity issue for asynchronous algorithms.

I thank Prof. Meichun Hsu and Prof. Les Valiant for serving on my thesis committee. Prof. Valiant's seminal work on parallel routing also strongly influences the direction of my research.

This book benefits from several people's comments, knowledge, and generosity. Prof. Rabin contributed to the proof of Theorem 7.1. Satish Rao first suggested the possibility of an information dispersal algorithm (IDA) based on the Fourier transform. After such an IDA had been developed (see Chapter 2), Prof. Krizanc of Rochester University pointed out that the scheme had largely been anticipated by Preparata [280]. Prof. Beaver of Pennsylvania State University also pointed out the connection between my scheme and Shamir's secret-sharing algorithm and subsequent idea advanced by Ben-Or, Goldwasser, and Wigderson [46] in that setting. (It turns out that all of them are Reed-Solomon codes.) Joe Kilian and Prof. Rabin improved the phrasing of Theorem 8.3. Prof. Tsantilas of Columbia University has always been a generous source on the literature of, and ideas about, routing. With the help of Bill Gear of NEC Research Institute, we showed that a global minimum is indeed produced by Eq. (6.8), correcting an error in the original proof of Lemma 6.15. Harry Bochner and Joanne Klys of Aiken Computation Laboratory, Harvard University, provided valuable assistance on the use of graphical tools and subtle features of IAT<sub>F</sub>X. Part of Chapter 3 was written at the Department of Computer Science and Information Engineering, National Taiwan University, under Kuo-Liang Chung's computer account. Jehoshua Bruck of IBM, Yonatan Aumann of the Hebrew University of Jerusalem,



xvi Acknowledgments

and Peter Mysliwietz of the University of Paderborn suggested relevant literature. Prof. McColl of Oxford University not only suggested the title, but also made the publication possible.

I am indebted to NEC Research Institute for the unmatched generosity and the vision that autonomy is essential to scientific inquiry. The research reported in my original dissertation was generously supported by National Science Foundation Grant MCS-8121431 at Harvard University.

It has been a pleasure to work with Dr. Alan Harvey, Editor of Mathematical Sciences, and Lauren Cowles, Editor of Mathematics and Computer Science, both at Cambridge University Press. My thanks are due to them and their staff.

The constant supports from my wife, Chih-Lan, made the writing experience a pleasant one. Although my son, Raymond, has increased in age since his birth when I was writing my thesis with him, I again had to write this book with him. Fortunately, now, as before, the computer has made the destruction of manuscripts much less lifethreatening.



# **Glossary of Notations**

notation	page number	notation	page number
≈	13	D	96
A	11	$D_1$	97
$A_{ij}$	11	$D_2$	99
$A_t(y)$	97	dim(i)	126
$A^T$	11	E(G)	52
$A^*$	11	E(i,l,t)	126
$A^{-1}$	11	F	14
${\cal A}$	14	F	9
$ ilde{\mathcal{A}}$	15	$F_{n,n}$	13
$\mathcal{A}_{\mathrm{FFT}}$	16	$G_1\subseteq G_2$	52
$\mathcal{A}_{ ext{V}}$	16	$G_1\cap G_2=\emptyset$	52
$a_t$	97	GF(p)	11
$\overline{a}$	34	G(V,E)	32
$[a_{ij}]_{\substack{1 \leq i \leq n \\ 1 \leq j \leq m}}$	11	I	11
$B^{1 \leq j \leq m}$	14	$\mathcal{I}_x$	135
BF(x)	52	IDA(n,m)	14
B(m,N,q)	54	L	14 and 53
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$bits_k(i)$	56	M	90
$bits_3(i)$	126	$M_i$	14
$eta_{m{x}}(l)$	96	$m_0$	53
$C_n$	55	$N_{oldsymbol{d},oldsymbol{n}}$	71
$C_{n-k}(y)$	56	$N_{d,n}\left( i:l ight)$	72
$C_{n-k-1}(i:l)$	62	nodes(l)	126
$\mathcal{C}(x)$	135	$n_0$	53
$\gamma_t$	103	$n_{x}$	96

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notation	page number
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${\cal P}$	127
P(i)	73
$P_{m{x}}$	53
$P_x(i)$	53
$P_x(i) \in V$	53
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$v_x(i)$	96
$x[\:i:j\:]$	55
x(i:l)	63
$x^{(i)}$	63 and 135
$x/\!/i$	55
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$X^*(t)$	103
$\mathbf{Z}_q$	11
$Z_{t,x,l}$	101
$\omega$	13