# Numerical Recipes

#### The Art of Scientific Computing

**Second Edition** 

#### Volume 1 of Fortran Numerical Recipes

#### William H. Press

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EXXON Research and Engineering Company

Published by the Press Syndicate of the University of Cambridge The Pitt Building, Trumpington Street, Cambridge CB2 1RP 40 West 20th Street, New York, NY 10011-4211, USA 10 Stamford Road, Oakleigh, Melbourne 3166, Australia

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First Edition originally published 1986; Second Edition originally published 1992 as Numerical Recipes in FORTRAN: The Art of Scientific Computing Reprinted with corrections, 1993, 1994, 1995. Reprinted with corrections, 1996, 1997, 2001, as Numerical Recipes in Fortran 77: The Art of Scientific Computing (Vol. 1 of Fortran Numerical Recipes)

This reprinting is corrected to software version 2.10

Printed in the United States of America Typeset in TEX

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Library of Congress Cataloging in Publication Data

Numerical recipes in Fortran 77 : the art of scientific computing / William H. Press ... [et al.]. – 2nd ed.

Includes bibliographical references (p. ) and index.

ISBN 0-521-43064-X

 Numerical analysis–Computer programs.
 Science–Mathematics–Computer programs.
 FORTRAN (Computer program language) I. Press, William H. OA297.N866 1992

519.4'0285'53–dc20

92-8876

A catalog record for this book is available from the British Library.

ISBN	0 521 43064 X	Volume 1 (this book)
ISBN	0 521 57439 0	Volume 2
ISBN	0 521 43721 0	Example book in FORTRAN
ISBN	0 521 57440 4	FORTRAN diskette (IBM 3.5")
ISBN	0 521 57608 3	CDROM (IBM PC/Macintosh)
ISBN	0 521 57607 5	CDROM (UNIX)

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