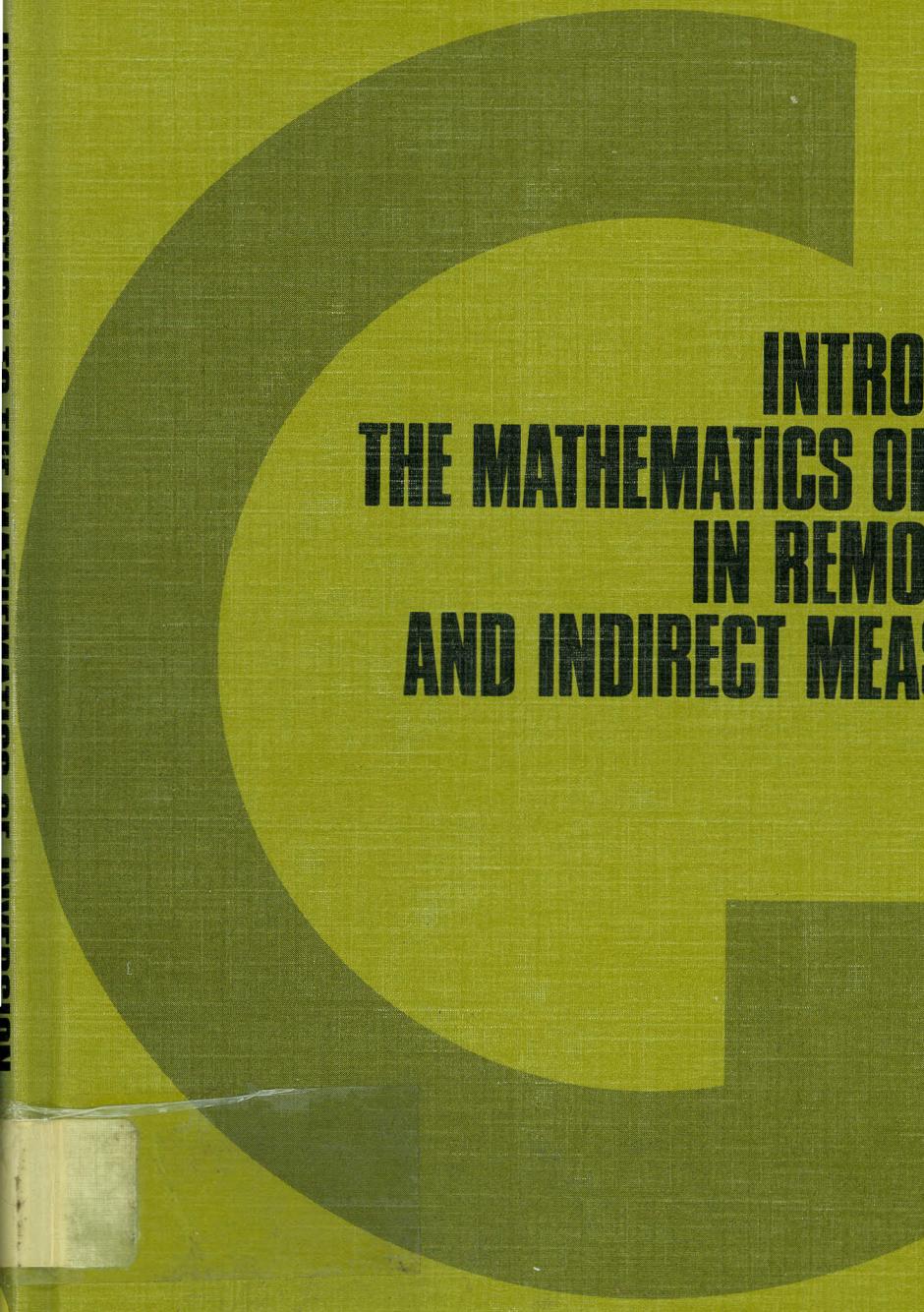


*Developments in Geomathematics* 3



**INTRODUCTION TO  
THE MATHEMATICS OF INVERSION  
IN REMOTE SENSING  
AND INDIRECT MEASUREMENTS**

*S. TWOMEY*

*Elsevier Scientific Publishing Company*

*Developments in Geomathematics 3*

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# INTRODUCTION TO THE MATHEMATICS OF INVERSION IN REMOTE SENSING AND INDIRECT MEASUREMENTS

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**ELSEVIER SCIENTIFIC PUBLISHING COMPANY**  
Amsterdam -- Oxford -- New York                    1977

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