## G. W. Stewart

University of Maryland College Park, Maryland

## AFTERNOTES

## goes to

 Graduate SCHOOL
## Lectures on Advanced Numerical Analysis

A series of lectures on advanced numerical analysis presented at the University of Maryland at College Park and recorded after the fact.

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