

Performance Evaluation and Attribution Volume 1 Asset Pricing and Models

Second Edition

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<p>A complete solutions manual for all chapter-end problems in this volume is available from the author, russwermers@gmail.com</p>
