



Analytics Optimization with Columnstore Indexes in Microsoft SQL Server

Optimizing OLAP Workloads

—
Edward Pollack

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Any source code or other supplementary material referenced by the author in this book is available to readers on GitHub at <https://github.com/Apress/analytics-optimization-w-columnstore-indexes-in-microsoft-sql-server>.

Printed on acid-free paper

*For Theresa, Nolan, and Oliver, without whom none of this
would be possible.*

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