



# Mapping Data Flows in Azure Data Factory

Building Scalable ETL Projects in the Microsoft Cloud

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Mark Kromer

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*This book is dedicated to my loving wife Stacy and our boys Ethan and Jude. Thank you for putting up with my late hours working on data analytics and writing this book!*

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