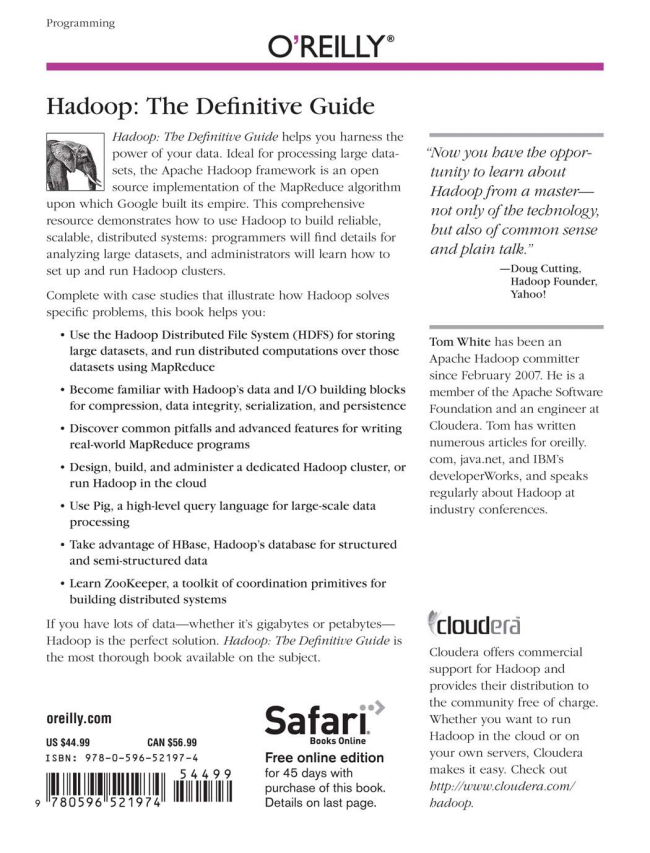


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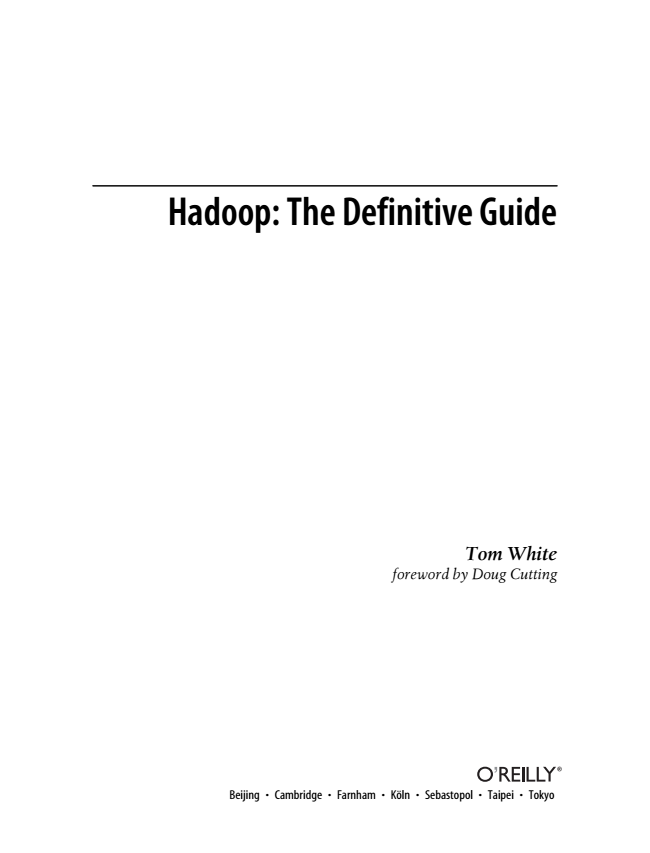
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Hadoop Founder, Yahoo!

Tom White has been an Apache Hadoop committer since February 2007. He is a member of the Apache Software Foundation and an engineer at Cloudera. Tom has written numerous articles for oreilly. com, java.net, and IBM's developerWorks, and speaks regularly about Hadoop at industry conferences.

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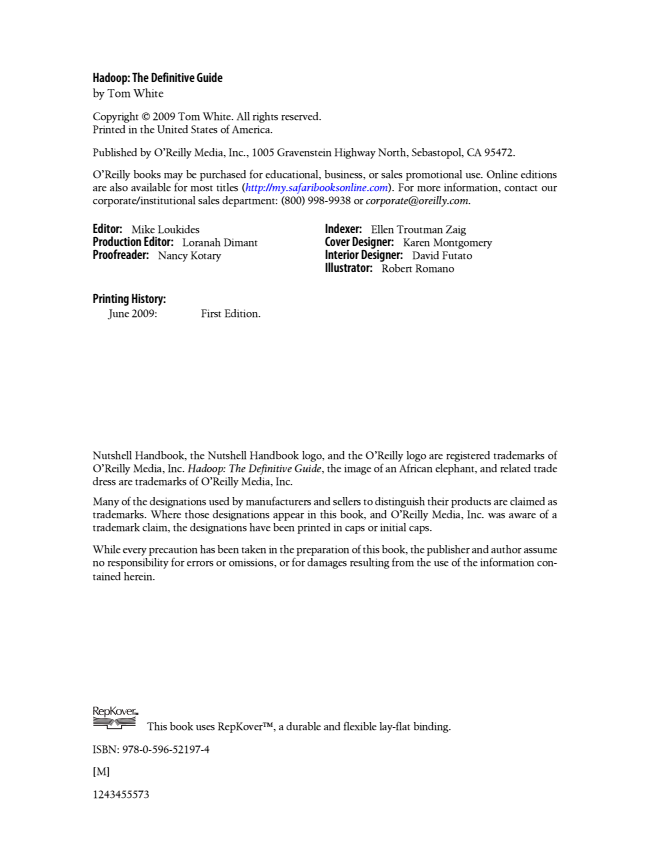
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**Hadoop: The Definitive Guide**

*Tom White foreword by Doug Cutting*

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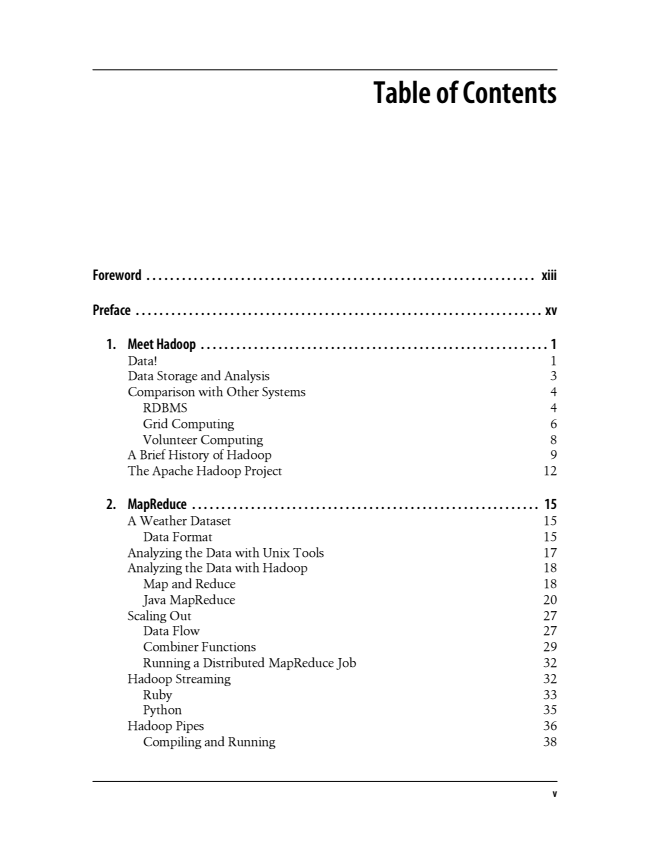
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*For Eliane, Emilia, and Lottie*

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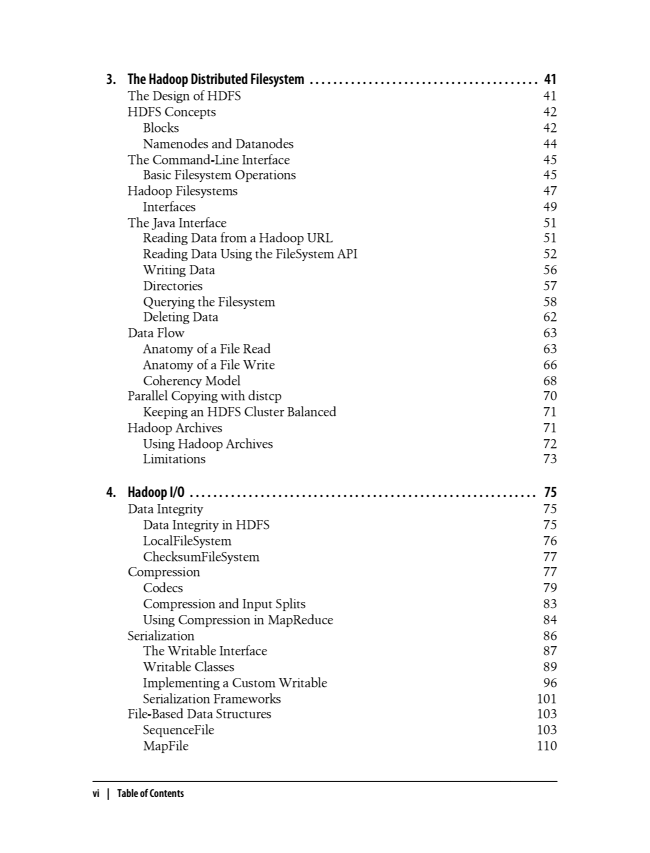
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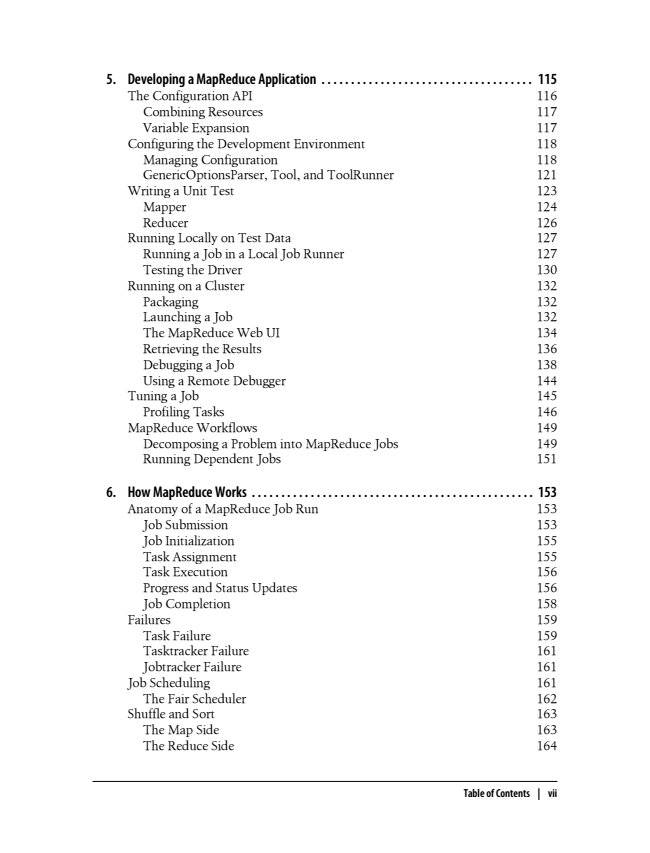
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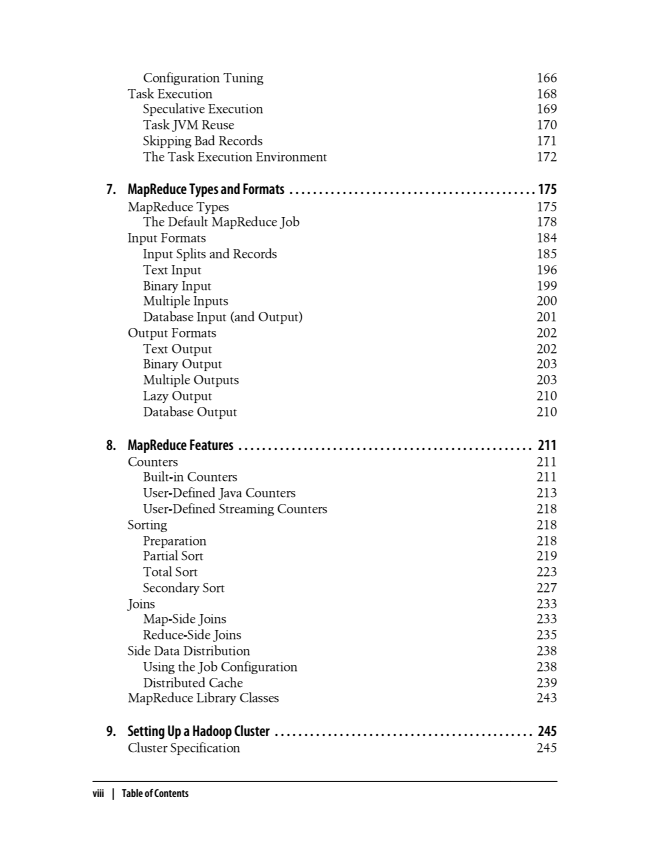
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